Ihotse

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Lhotse development team

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GETTING STARTED



Lhotse is a Python library aiming to make speech and audio data preparation flexible and accessible to a wider community. Alongside k2, it is a part of the next generation Kaldi speech processing library.

1.1 About

1.1.1 Main goals

- Attract a wider community to speech processing tasks with a Python-centric design.
- Accommodate experienced Kaldi users with an expressive command-line interface.
- Provide standard data preparation recipes for commonly used corpora.
- Provide PyTorch Dataset classes for speech and audio related tasks.
- Flexible data preparation for model training with the notion of audio cuts.
- Efficiency, especially in terms of I/O bandwidth and storage capacity.

1.1.2 Main ideas

Like Kaldi, Lhotse provides standard data preparation recipes, but extends that with a seamless PyTorch integration through task-specific Dataset classes. The data and meta-data are represented in human-readable text manifests and exposed to the user through convenient Python classes.

Lhotse introduces the notion of audio cuts, designed to ease the training data construction with operations such as mixing, truncation and padding that are performed on-the-fly to minimize the amount of storage required. Data augmentation and feature extraction are supported both in pre-computed mode, with highly-compressed feature matrices stored on disk, and on-the-fly mode that computes the transformations upon request. Additionally, Lhotse introduces feature-space cut mixing to make the best of both worlds.

1.2 Installation

Lhotse supports Python version 3.7 and later.

1.2.1 Pip

Lhotse is available on PyPI:

```
pip install lhotse
```

To install the latest, unreleased version, do:

```
pip install git+https://github.com/lhotse-speech/lhotse
```

1.2.2 Development installation

For development installation, you can fork/clone the GitHub repo and install with pip:

```
git clone https://github.com/lhotse-speech/lhotse
cd lhotse
pip install -e '.[dev]'

# Running unit tests
pytest test
```

This is an editable installation (-e option), meaning that your changes to the source code are automatically reflected when importing lhotse (no re-install needed). The [dev] part means you're installing extra dependencies that are used to run tests, build documentation or launch jupyter notebooks.

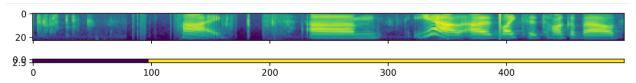
1.3 Examples

We have example recipes showing how to prepare data and load it in Python as a PyTorch Dataset. They are located in the examples directory.

A short snippet to show how Lhotse can make audio data prepartion quick and easy:

```
from lhotse import CutSet, Fbank, LilcomFilesWriter
from lhotse.dataset import VadDataset
from lhotse.recipes import prepare_switchboard
# Prepare data manifests from a raw corpus distribution.
# The RecordingSet describes the metadata about audio recordings;
# the sampling rate, number of channels, duration, etc.
# The SupervisionSet describes metadata about supervision segments:
# the transcript, speaker, language, and so on.
swbd = prepare_switchboard('/export/corpora3/LDC/LDC97S62')
# CutSet is the workhorse of Lhotse, allowing for flexible data manipulation.
# We create 5-second cuts by traversing SWBD recordings in windows.
# No audio data is actually loaded into memory or stored to disk at this point.
cuts = CutSet.from_manifests(
    recordings=swbd['recordings'],
    supervisions=swbd['supervisions']
).cut_into_windows(duration=5)
# We compute the log-Mel filter energies and store them on disk;
# Then, we pad the cuts to 5 seconds to ensure all cuts are of equal length,
# as the last window in each recording might have a shorter duration.
# The padding will be performed once the features are loaded into memory.
with LilcomFilesWriter('feats') as storage:
    cuts = cuts.compute_and_store_features(
        extractor=Fbank(),
        storage=storage,
    ).pad(duration=5.0)
# Construct a Pytorch Dataset class for Voice Activity Detection task:
dataset = VadDataset(cuts)
dataset[0]
```

The VadDataset will yield a pair of input and supervision tensors such as the following - the speech starts roughly at the first second (100 frames):



1.3. Examples 3

CHAPTER

TWO

REPRESENTING A CORPUS

In Lhotse, we represent the data using YAML (more readable) or JSON (faster) manifests. For most audio corpora, we will need two types of manifests to fully describe them: a recording manifest and a supervision manifest.

Caution: We show all the examples in YAML format for improved readability. However, when processing medium/large datasets, we recommend to use JSON, which is much quicker to load and save.

2.1 Recording manifest

The recording manifest describes the recordings in a given corpus. It only contains information about the recording itself - this manifest does not specify any segmentation information or supervision such as the transcript or the speaker. It means that when a recording is a 1 hour long file, it is a single item in this manifest.

When coming from Kaldi, think of it as wav.scp on steroids, that also contains reco2dur, reco2num_samples and some extra information.

This is a YAML manifest for a corpus with two recordings:

```
- id: 'recording-1'
 sampling rate: 8000
 num samples: 4000
 duration: 0.5
 sources:
    - type: file
     channels: [0]
     source: 'test/fixtures/mono_c0.wav'
    - type: file
     channels: [1]
      source: 'test/fixtures/mono_c1.wav'
- id: 'recording-2'
 sampling rate: 8000
 num_samples: 8000
 duration: 1.0
 sources:
    - type: file
      channels: [0, 1]
      source: 'test/fixtures/stereo.wav'
```

Each recording is described by:

• a unique id,

- its sampling rate,
- the number of samples,
- the duration in seconds,
- · a list of audio sources.

Audio source is a useful abstraction for cases when the user has an audio format not supported by the library, or wants to use shell tools such as SoX to perform some additional preprocessing. An audio source has the following properties:

- type: either file or command
- channel_ids: a list of integer identifiers for each channel in the recording
- source: in case of a file, it's a path; in case of a command, its a shell command that will be expected to write a
 WAVE file to stdout.

2.1.1 Python

In Python, the recording manifest is represented by classes RecordingSet, Recording, and AudioSource. Example usage:

2.2 Supervision manifest

The supervision manifest contains the supervision information that we have about the recordings. In particular, it involves the segmentation - there might be a single segment for a single utterance recording, and multiple segments for a recording of a conversion.

When coming from Kaldi, think of it as a segments file on steroids, that also contains utt2spk, utt2gender, utt2dur, etc.

This is a YAML supervision manifest:

```
---
- id: 'segment-1'
recording_id: 'recording-2'
channel: 0
start: 0.1
duration: 0.3
text: 'transcript of the first segment'
language: 'english'
speaker: 'Norman Dyhrentfurth'

- id: 'segment-2'
recording_id: 'recording-2'
```

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```
start: 0.5
duration: 0.4
```

Each segment is characterized by the following attributes:

- a unique id,
- a corresponding recording id,
- start time in seconds, relative to the beginning of the recording,
- the duration in seconds

Each segment may be assigned optional supervision information. In this example, the first segment contains the transcription text, the language of the utterance and a speaker name. The second segment contains only the minimal amount of information, which should be interpreted as: "this is some area of interest in the recording that we know nothing else about."

2.2.1 Python

In Python, the supervision manifest is represented by classes SupervisionSet and SupervisionSegment. Example usage:

```
supervisions = SupervisionSet.from_segments([
    SupervisionSegment(
        id='segment-1',
        recording_id='recording-1',
        start=0.5,
        duration=10.7,
        text='quite a long utterance'
    )
])
print(f'There is {len(supervisions)} supervision in the set.')
```

2.3 Standard data preparation recipes

We provide a number of standard data preparation recipes. By that, we mean a collection of a Python function + a CLI tool that create the manifests given a corpus directory.

Currently supported corpora:

- AMI lhotse.recipes.prepare_ami()
- English Broadcast News 1997 lhotse.recipes.prepare_broadcast_news()
- Full or Mini LibriSpeech lhotse.recipes.prepare_librispeech()
- Heroico lhotse.recipes.prepare_heroico()
- LJ Speech lhotse.recipes.prepare_ljspeech()
- Mini LibriMix lhotse.recipes.prepare_librimix()
- Switchboard lhotse.recipes.prepare_switchboard()
- TED-LIUM v3 lhotse.recipes.prepare_tedlium()

2.4 Adding new corpora

General pointers:

- Each corpus has a dedicated Python file in lhotse/recipes.
- For publicly available corpora that can be freely downloaded, we usually define a function called download, download_and_untar, etc.
- Each data preparation recipe should expose a single function called prepare_X, with X being the name of the corpus, that produces dicts like: { 'recordings': <RecordingSet>, 'supervisions': <SupervisionSet>} for the data in that corpus.
- When a corpus defines standard split (e.g. train/dev/test), we return a dict with the following structure: {'train': {'recordings': <RecordingSet>, 'supervisions': <SupervisionSet>}, 'dev': ...}
- Some corpora (like LibriSpeech) come with pre-segmented recordings. In these cases, the SupervisionSegment will exactly match the Recording duration (and there will likely be exactly one segment corresponding to any recording).
- Corpora with longer recordings (e.g. conversational, like Switchboard) should have exactly one Recording object corresponding to a single conversation/session, that spans its whole duration. Each speech segment in that recording should be represented as a SupervisionSegment with the same recording_id value.
- Corpora with multiple channels for each session (e.g. AMI) should have a single Recording with multiple AudioSource objects each corresponding to a separate channel.

CHAPTER

THREE

CUTS

3.1 Overview

Audio cuts are one of the main Lhotse features. Cut is a part of a recording, but it can be longer than a supervision segment, or even span multiple segments. The regions without a supervision are just audio that we don't assume we know anything about - there may be silence, noise, non-transcribed speech, etc. Task-specific datasets can leverage this information to generate masks for such regions.

Currently, cuts are created after the feature extraction step (we might still change that). It means that every cut also represents the extracted features for the part of recording it represents.

Cuts can be modified using three basic operations: truncation, mixing and appending. These operations are not immediately performed on the audio or features. Instead, we create new Cut objects, possibly of different types, that represent a cut after modification. We only modify the actual audio and feature matrices once the user calls load_features() or load_audio().

This design allows for quick on-the-fly data augmentation. In each training epoch, we may mix the cuts with different noises, SNRs, etc. We also do not need to re-compute and store the features for different mixes, as the mixing process consists of element-wise addition of the spectral energies (possibly with additional exp and log operations for log-energies). As of now, we only support this dynamic mix on log Mel energy (_fbank_) features. We anticipate to add support for other types of features as well.

The common attributes for all cut objects are the following:

- id
- · duration
- · supervisions
- num_frames
- · num_features
- load features()
- truncate()
- mix()
- append()
- from dict()

3.2 Types of cuts

There are three cut classes:

- Cut, also referred to as "simple cut", can be traced back to a single particular recording (and channel).
- PaddingCut is an "artificial" recording used for padding other Cuts through mixing to achieve uniform duration
- MixedCut is a collection of Cut and PaddingCut objects, together with mix parameters: offset and desired sound-to-noise ratio (SNR) for each track. Both the offset and the SNR are relative to the first cut in the mix.

Each of these types has additional attributes that are not common - e.g., it makes sense to specify *start* for Cut to locate it in the source recording, but it is undefined for MixedCut and PaddingCut.

3.3 Cut manifests

All cut types can be stored in the YAML manifests. An example manifest with simple cuts might look like:

```
- duration: 10.0
features:
    channels: 0
    duration: 16.04
    num_features: 23
    num_frames: 1604
    recording_id: recording-1
    start: 0.0
    storage_path: test/fixtures/libri/storage/dc2e0952-f2f8-423c-9b8c-f5481652eeld.llc
    storage_type: lilcom
    type: fbank
    id: 849e13d8-61a2-4d09-a542-dac1aee1b544
    start: 0.0
    supervisions: []
    type: Cut
```

Notice that the cut type is specified in YAML. The supervisions list might be empty - some tasks do not need them, e.g. unsupervised training, source separation, or speech enhancement.

Mixed cuts look differently in the manifest:

```
- id: mixed-cut-id
 tracks:
   - cut:
       duration: 7.78
       features:
         channels: 0
         duration: 7.78
         type: fbank
         num_frames: 778
         num_features: 23
         recording_id: 7850-286674-0014
         start: 0.0
         storage_path: test/fixtures/mix_cut_test/feats/storage/9dc645db-cbe4-4529-
→85e4-b6ed4f59c340.llc
         storage_type: lilcom
       id: 0c5fdf79-efe7-4d45-b612-3d90d9af8c4e
```

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```
start: 0.0
       supervisions:
         - channel: 0
           duration: 7.78
           gender: f
           id: 7850-286674-0014
           language: null
           recording_id: 7850-286674-0014
           speaker: 7850-286674
           start: 0.0
           text: SURE ENOUGH THERE HE CAME THROUGH THE SHALLOW WATER HIS WET BACK_
→SHELL PARTLY
             OUT OF IT AND SHINING IN THE SUNLIGHT
     offset: 0.0
   - cut:
       duration: 9.705
       features:
         channels: 0
         duration: 9.705
         type: fbank
         num_frames: 970
         num_features: 23
         recording_id: 2412-153948-0014
         start: 0.0
         storage_path: test/fixtures/mix_cut_test/feats/storage/5078e7eb-57a6-4000-
→b0f2-fa4bf9c52090.llc
         storage_type: lilcom
       id: 78bef88d-e62e-4cfa-9946-a1311442c6f7
       start: 0.0
       supervisions:
          - channel: 0
           duration: 9.705
           gender: f
           id: 2412-153948-0014
           language: null
           recording_id: 2412-153948-0014
           speaker: 2412-153948
           start: 0.0
           text: THERE WAS NO ONE IN THE WHOLE WORLD WHO HAD THE SMALLEST IDEA SAVE,
→THOSE
             WHO WERE THEMSELVES ON THE OTHER SIDE OF IT IF INDEED THERE WAS ANY ONE.
→AT ALL
             COULD I HOPE TO CROSS IT
     offset: 3.89
     snr: 20.0
 type: MixedCut
```

Mixed cuts literally consist of simple cuts, their feature descriptions, and their supervisions. These are combined together when a user queries MixedCut for supervisions, features, or duration. Note that the first simple cut is missing an SNR field - it is optional (i.e. *None*). That is because the semantics of 0 SNR are: re-scale one of the signals, so that the SNR between two signals is zero. We denote no re-scaling by not specifying the SNR at all.

The amount of text in these manifests can be considerable in larger datasets, but they are highly compressible. We support their automated (de-)compression with gzip - it's sufficient to add ".gz" at the end of filename when writing or reading, both in Python classes and the CLI tools.

3.3. Cut manifests

3.4 Python

Some examples of how cuts can be manipulated to create a desired dataset for model training.

```
cuts = CutSet.from_yaml('cuts.yml')
# Reject too short segments
cuts = cuts.filter(lambda cut: cut.duration >= 3.0)
# Pad short segments with silence to 5 seconds.
cuts = cuts.pad(desired_duration=5.0)
# Truncate longer segments to 5 seconds.
cuts = cuts.truncate(max_duration=5.0, offset_type='random')
# Save cuts
cuts.to_yaml('cuts-5s.yml')
```

3.5 CLI

Analogous examples of how to perform the same operations in the terminal:

```
# Reject short segments

lhotse yaml filter duration>=3.0 cuts.yml cuts-3s.yml

# Pad short segments to 5 seconds.

lhotse cut pad --duration 5.0 cuts-3s.yml cuts-5s-pad.yml

# Truncate longer segments to 5 seconds.

lhotse cut truncate --max-duration 5.0 --offset-type random cuts-5s-pad.yml cuts-5s.

→yml
```

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CHAPTER

FOUR

FEATURE EXTRACTION

Feature extraction in Lhotse is currently based exclusively on the Torchaudio library. We support spectrograms, log-Mel energies (*fbank*) and MFCCs. *Fbank* are the default features. We also support custom defined feature extractors via a Python API (which won't be available in the CLI, unless there is a popular demand for that).

We are striving for a simple relation between the audio duration, the number of frames, and the frame shift. You only need to know two of those values to compute the third one, regardless of the frame length. This is equivalent of having Kaldi's snip_edges parameter set to False.

4.1 Storing features

Features in Lhotse are stored as numpy matrices with shape (num_frames, num_features). By default, we use lilcom for lossy compression and reduce the size on the disk by about 3x. The lilcom compression method uses a fixed precision that doesn't depend on the magnitude of the thing being compressed, so it's better suited to log-energy features than energy features. We currently support two kinds of storage:

- HDF5 files with multiple feature matrices
- directory with feature matrix per file

We retrieve the arrays by loading the whole feature matrix from disk and selecting the relevant region (e.g. specified by a cut). Therefore it makes sense to cut the recordings first, and then extract the features for them to avoid loading unnecessary data from disk (especially for very long recordings).

There are two types of manifests:

- one describing the feature extractor;
- · one describing the extracted feature matrices.

The feature extractor manifest is mapped to a Python configuration dataclass. An example for *spectrogram*:

```
dither: 0.0
energy_floor: 1e-10
frame_length: 0.025
frame_shift: 0.01
min_duration: 0.0
preemphasis_coefficient: 0.97
raw_energy: true
remove_dc_offset: true
round_to_power_of_two: true
window_type: povey
type: spectrogram
```

And the corresponding configuration class:

```
class lhotse.features.SpectrogramConfig (dither: float = 0.0, window type: str = 'povey',
                                               frame length:
                                                              float = 0.025, frame\_shift:
                                               float = 0.01, remove dc offset: bool = True,
                                               round_to_power_of_two: bool = True, en-
                                               ergy_floor: float = 1e-10, min_duration: float
                                                = 0.0, preemphasis coefficient: float = 0.97,
                                                raw \ energy: bool = True)
    dither: float = 0.0
    window type: str = 'povey'
    frame_length: float = 0.025
    frame_shift: float = 0.01
    remove dc offset: bool = True
    round_to_power_of_two: bool = True
    energy_floor:
                      float = 1e-10
    min_duration:
                      float = 0.0
    preemphasis coefficient: float = 0.97
    raw energy: bool = True
      init (dither=0.0,
                            window type='povey',
                                                 frame length=0.025,
                                                                     frame shift=0.01,
               move_dc_offset=True,
                                        round_to_power_of_two=True,
                                                                         energy_floor=1e-10,
               min duration=0.0, preemphasis coefficient=0.97, raw energy=True)
         Initialize self. See help(type(self)) for accurate signature.
```

The feature matrices manifest is a list of documents. These documents contain the information necessary to tie the features to a particular recording: start, duration, channel and recording_id. They currently do not have their own IDs. They also provide some useful information, such as the type of features, number of frames and feature dimension. Finally, they specify how the feature matrix is stored with storage_type (currently numpy or lilcom), and where to find it with the storage_path. In the future there might be more storage types.

```
- channels: 0
  duration: 16.04
  num_features: 23
  num_frames: 1604
  recording_id: recording-1
  start: 0.0
  storage_path: test/fixtures/libri/storage/dc2e0952-f2f8-423c-9b8c-f5481652ee1d.llc
  storage_type: lilcom
  type: fbank
```

4.2 Creating custom feature extractor

There are two components needed to implement a custom feature extractor: a configuration and the extractor itself. We expect the configuration class to be a dataclass, so that it can be automatically mapped to dict and serialized. The feature extractor should inherit from FeatureExtractor, and implement a small number of methods/properties. The base class takes care of initialization (you need to pass a config object), serialization to YAML, etc. A minimal, complete example of adding a new feature extractor:

```
from scipy.signal import stft
@dataclass
class ExampleFeatureExtractorConfig:
   frame_len: Seconds = 0.025
    frame_shift: Seconds = 0.01
class ExampleFeatureExtractor(FeatureExtractor):
    A minimal class example, showing how to implement a custom feature extractor in ...
→ Lhotse.
    name = 'example-feature-extractor'
   config_type = ExampleFeatureExtractorConfig
   def extract(self, samples: np.ndarray, sampling_rate: int) -> np.ndarray:
        f, t, Zxx = stft(
            samples,
            sampling_rate,
            nperseg=round(self.config.frame_len * sampling_rate),
            noverlap=round(self.frame_shift * sampling_rate)
        )
        # Note: returning a magnitude of the STFT might interact badly with lilcom,
\hookrightarrow compression,
        # as it performs quantization of the float values and works best with log-
\rightarrow scale quantities.
        # It's advised to turn lilcom compression off, or use log-scale, in such,
⇔cases.
        return np.abs(Zxx)
    @property
    def frame_shift(self) -> Seconds:
        return self.config.frame_shift
    def feature_dim(self, sampling_rate: int) -> int:
        return (sampling_rate * self.config.frame_len) / 2 + 1
```

The overridden members include:

- name for easy debuggability/automatic re-creation of an extractor;
- $\bullet \ \, {\tt config_type} \ \, {\tt which} \ \, {\tt specifies} \ \, {\tt the} \ \, {\tt complementary} \ \, {\tt configuration} \ \, {\tt class} \ \, {\tt type};$
- extract() where the actual computation takes place;
- frame_shift property, which is key to know the relationship between the duration and the number of frames.
- feature_dim() method, which accepts the sampling_rate as its argument, as some types of features (e.g. spectrogram) will depend on that.

Additionally, there are two extra methods than when overridden, allow to perform dynamic feature-space mixing (see Cuts):

```
@staticmethod
def mix(features_a: np.ndarray, features_b: np.ndarray, gain_b: float) -> np.ndarray:
    raise ValueError(f'The feature extractor\'s "mix" operation is undefined.')
@staticmethod
```

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```
def compute_energy(features: np.ndarray) -> float:
    raise ValueError(f'The feature extractor\'s "compute_energy" is undefined.')
```

They are:

- mix() which specifies how to mix two feature matrices to obtain a new feature matrix representing the sum of signals;
- compute_energy () which specifies how to obtain a total energy of the feature matrix, which is needed to mix two signals with a specified SNR. E.g. for a power spectrogram, this could be the sum of every time-frequency bin. It is expected to never return a zero.

During the feature-domain mix with a specified signal-to-noise ratio (SNR), we assume that one of the signals is a reference signal - it is used to initialize the FeatureMixer class. We compute the energy of both signals and scale the non-reference signal, so that its energy satisfies the requested SNR. The scaling factor (gain) is computed using the following formula:

Note that we interpret the energy and the SNR in a power quantity context (as opposed to root-power/field quantities).

4.3 Storage backend details

Lhotse can be extended with additional storage backends via two abstractions: FeaturesWriter and FeaturesReader. We currently implement the following writers (and their corresponding readers):

- lhotse.features.io.LilcomFilesWriter
- lhotse.features.io.NumpyFilesWriter
- lhotse.features.io.LilcomHdf5Writer
- lhotse.features.io.NumpyHdf5Writer

The FeaturesWriter and FeaturesReader API is as follows:

class lhotse.features.io.FeaturesWriter

FeaturesWriter defines the interface of how to store numpy arrays in a particular storage backend. This backend could either be:

- separate files on a local filesystem;
- a single file with multiple arrays;
- cloud storage;
- etc.

Each class inheriting from FeaturesWriter must define:

- the write() method, which defines the storing operation (accepts a key used to place the value array in the storage);
- the storage_path () property, which is either a common directory for the files, the name of the file storing multiple arrays, name of the cloud bucket, etc.
- the name () property that is unique to this particular storage mechanism it is stored in the features manifests (metadata) and used to automatically deduce the backend when loading the features.

Each FeaturesWriter can also be used as a context manager, as some implementations might need to free a resource after the writing is finalized. By default nothing happens in the context manager functions, and this can be modified by the inheriting subclasses.

Example:

with MyWriter('some/path') as storage: extractor.extract_from_recording_and_store(recording, storage)

The features loading must be defined separately in a class inheriting from FeaturesReader.

```
abstract property name
```

Return type str

abstract property storage_path

Return type str

abstract write(key, value)

Return type str

class lhotse.features.io.FeaturesReader

FeaturesReader defines the interface of how to load numpy arrays from a particular storage backend. This backend could either be:

- separate files on a local filesystem;
- a single file with multiple arrays;
- · cloud storage;
- etc.

Each class inheriting from FeaturesReader must define:

- the read() method, which defines the loading operation (accepts the key to locate the array in the storage and return it). The read method should support selecting only a subset of the feature matrix, with the bounds expressed as arguments left_offset_frames and right_offset_frames. It's up to the Reader implementation to load only the required part or trim it to that range only after loading. It is assumed that the time dimension is always the first one.
- the name () property that is unique to this particular storage mechanism it is stored in the features manifests (metadata) and used to automatically deduce the backend when loading the features.

The features writing must be defined separately in a class inheriting from FeaturesWriter.

```
abstract property name
```

```
Return type str
```

abstract read(key, left_offset_frames=0, right_offset_frames=None)

Return type ndarray

4.4 Python usage

The feature manifest is represented by a FeatureSet object. Feature extractors have a class that represents both the extract and its configuration, named FeatureExtractor. We provide a utility called FeatureSetBuilder that can process a RecordingSet in parallel, store the feature matrices on disk and generate a feature manifest.

For example:

```
from lhotse import RecordingSet, Fbank, LilcomFilesWriter
# Read a RecordingSet from disk
recording_set = RecordingSet.from_yaml('audio.yml')
# Create a log Mel energy filter bank feature extractor with default settings
feature_extractor = Fbank()
# Create a feature set builder that uses this extractor and stores the results in a.
→directory called 'features'
with LilcomFilesWriter('features') as storage:
   builder = FeatureSetBuilder(feature_extractor=feature_extractor, storage=storage)
    # Extract the features using 8 parallel processes, compress, and store them on in
→ 'features/storage/' directory.
    # Then, return the feature manifest object, which is also compressed and
    # stored in 'features/feature_manifest.json.gz'
    feature_set = builder.process_and_store_recordings(
        recordings=recording_set,
        num_jobs=8
    )
```

4.5 CLI usage

An equivalent example using the terminal:

```
lhotse write-default-feature-config feat-config.yml
lhotse make-feats -j 8 --storage-type lilcom_files -f feat-config.yml audio.yml_

ofeatures/
```

4.6 Kaldi compatibility caveats

We are relying on Torchaudio Kaldi compatibility module, so most of the spectrogram/fbank/mfcc parameters are the same as in Kaldi. However, we are not fully compatible - Kaldi computes energies from a signal scaled between -32,768 to 32,767, while Torchaudio scales the signal between -1.0 and 1.0. It results in Kaldi energies being significantly greater than in Lhotse. By default, we turn off dithering for deterministic feature extraction.

CHAPTER

FIVE

AUGMENTATION

We support time-domain data augmentation via WavAugment and torchaudio libraries. They both leverage libsox to provide about 50 different audio effects like reverb, speed perturbation, pitch, etc.

Since WavAugment depends on libsox, it is an optional depedency for Lhotse, which can be installed using tools/install_wavaugment.sh (for convenience, the script will also compile libsox from source - note that the WavAugment authors warn their library is untested on Mac).

Torchaudio also depends on libsox, but seems to provide it when installed via anaconda. This functionality is only available with PyTorch 1.7+ and torchaudio 0.7+.

Using Lhotse's Python API, you can compose an arbitrary effect chain. On the other hand, for the CLI we provide a small number of predefined effect chains, such as pitch (pitch shifting), reverb (reverberation), and pitch_reverb_tdrop (pitch shift + reverberation + time dropout of a 50ms chunk).

5.1 Python usage

Warning: When using WavAugment or torchaudio data augmentation together with a multiprocessing executor (i.e. ProcessPoolExecutor), it is necessary to start it using the "spawn" context. Otherwise the process may hang (or terminate) on some systems due to libsox internals not handling forking well. Use: ProcessPoolExecutor(..., mp_context=multiprocessing.get_context("spawn")).

Lhotse's FeatureExtractor and Cut offer convenience functions for feature extraction with data augmentation performed before that. These functions expose an optional parameter called augment_fn that has a signature like:

```
def augment_fn(audio: Union[np.ndarray, torch.Tensor], sampling_rate: int) → np.
→ndarray: ...
```

For torchaudio we define a SoxEffectTransform class:

```
class lhotse.augmentation.SoxEffectTransform(effects)
```

Class-style wrapper for torchaudio SoX effect chains. It should be initialized with a config-like list of items that define SoX effect to be applied. It supports sampling randomized values for effect parameters through the RandomValue wrapper.

Example:

```
>>> audio = np.random.rand(16000)
>>> augment_fn = SoxEffectTransform(effects=[
>>> ['reverb', 50, 50, RandomValue(0, 100)],
>>> ['speed', RandomValue(0.9, 1.1)],
```

(continues on next page)

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```
>>> ['rate', 16000],
>>> ])
>>> augmented = augment_fn(audio, 16000)
```

See SoX manual or torchaudio.sox_effects.effect_names() for the list of possible effects. The parameters and the meaning of the values are explained in SoX manual/help.

```
init (effects)
```

Initialize self. See help(type(self)) for accurate signature.

```
sample_effects()
```

Resolve a list of effects, replacing random distributions with samples from them. It converts every number to string to match the expectations of torchaudio.

```
Return type List[List[str]]
```

We define a WavAugmenter class that is a thin wrapper over WavAugment. It can either be created with a predefined, or a user-supplied effect chain.

```
class lhotse.augmentation.WavAugmenter(effect_chain)
```

A wrapper class for WavAugment's effect chain. You should construct the augment. EffectChain beforehand and pass it on to this class.

This class is only available when WavAugment is installed, as it is an optional dependency for Lhotse. It can be installed using the script in "<main-repo-directory>/tools/install_wavaugment.sh"

For more details on how to augment, see https://github.com/facebookresearch/WavAugment

```
___init___(effect_chain)
```

Initialize self. See help(type(self)) for accurate signature.

```
static create_predefined(name, sampling_rate, **kwargs)
```

Create a WavAugmenter class with one of the predefined augmentation setups available in Lhotse. Some examples are: "pitch", "reverb", "pitch_reverb_tdrop".

Parameters

- name (str) the name of the augmentation setup.
- **sampling_rate** (int) expected sampling rate of the input audio.

Return type WavAugmenter

5.2 CLI usage

To extract features from augmented audio, you can pass an extra --augmentation argument to lhotse feat extract.

```
lhotse feat extract -a pitch ...
```

You can create a dataset with both clean and augmented features by combining different variants of extracted features, e.g.:

PYTORCH DATASETS

Caution: Lhotse datasets are still very much in the works and are subject to breaking changes.

We supply subclasses of the torch.data.Dataset for various audio/speech tasks. These datasets are created from CutSet objects and load the features from disk into memory on-the-fly. Each dataset accepts an optional root_dir argument which is used as a prefix for the paths to features and audio.

Currently, we provide the following:

A PyTorch Dataset for the speaker diarization task. Our assumptions about speaker diarization are the following:

- we assume a single channel input (for now), which could be either a true mono signal or a beamforming result from a microphone array.
- we assume that the supervision used for model training is a speech activity matrix, with one row
 dedicated to each speaker (either in the current cut or the whole dataset, depending on the settings). The columns correspond to feature frames. Each row is effectively a Voice Activity
 Detection supervision for a single speaker. This setup is somewhat inspired by the TS-VAD paper:
 https://arxiv.org/abs/2005.07272

Each item in this dataset is a dict of:

```
{
   'features': (T x F) tensor
   'speaker_activity': (num_speaker x T) tensor
}
```

Constructor arguments:

Parameters

- cuts (CutSet) a CutSet used to create the dataset object.
- min_speaker_dim(Optional[int]) optional int, when specified it will enforce that the matrix shape is at least that value (useful for datasets like CHiME 6 where the number of speakers is always 4, but some cuts might have less speakers than that).
- **global_speaker_ids** (bool) a bool, indicates whether the same speaker should always retain the same row index in the speaker activity matrix (useful for speaker-dependent systems)
- root_dir a prefix path to be attached to the feature files paths.

```
__init__(cuts, min_speaker_dim=None, global_speaker_ids=False)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.dataset.unsupervised.UnsupervisedDataset(cuts)
```

Dataset that contains no supervision - it only provides the features extracted from recordings. The returned features are a torch. Tensor of shape $(T \times F)$, where T is the number of frames, and F is the feature dimension.

```
___init___(cuts)
```

Initialize self. See help(type(self)) for accurate signature.

```
class lhotse.dataset.unsupervised.UnsupervisedWaveformDataset(cuts)
```

A variant of UnsupervisedDataset that provides waveform samples instead of features. The output is a tensor of shape (C, T), with C being the number of channels and T the number of audio samples. In this implementation, there will always be a single channel.

```
\textbf{class} \hspace{0.1in} \texttt{lhotse.dataset.unsupervised.DynamicUnsupervisedDataset} \hspace{0.1in} (\textit{\textit{feature\_extractor}},
```

```
cuts, aug-
ment_fn=None)
```

An example dataset that shows how to use on-the-fly feature extraction in Lhotse. It accepts two additional inputs - a FeatureExtractor and an optional WavAugmenter for time-domain data augmentation.. The output is approximately the same as that of the UnsupervisedDataset - there might be slight differences for MixedCut``s, because this dataset mixes them in the time domain, and ``UnsupervisedDataset does that in the feature domain. Cuts that are not mixed will yield identical results in both dataset classes.

```
__init__(feature_extractor, cuts, augment_fn=None)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.dataset.speech_recognition.SpeechRecognitionDataset(cuts)
```

The PyTorch Dataset for the speech recognition task. Each item in this dataset is a dict of:

```
{
    'features': (T x F) tensor,
    'text': string,
    'supervisions_mask': (T) tensor
}
```

The supervisions_mask field is a mask that specifies which frames are covered by a supervision by assigning a value of 1 (in this case: segments with transcribed speech contents), and which are not by asigning a value of 0 (in this case: padding, contextual noise, or in general the acoustic context without transcription).

In the future, will be extended by graph supervisions.

```
__init__ (cuts)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.dataset.speech_recognition.K2SpeechRecognitionIterableDataset (cuts,
```

```
max_frames=26000,
max_cuts=None,
shuf-
fle=False,
con-
cat_cuts=True,
con-
cat_cuts_gap=1.0,
con-
cat_cuts_duration_fact
```

The PyTorch Dataset for the speech recognition task using K2 library.

This dataset internally batches and collates the Cuts and should be used with PyTorch DataLoader with argument batch_size=None to work properly. The batch size is determined automatically to satisfy the constraints of max frames and max cuts.

This dataset will automatically partition itself when used with a multiprocessing DataLoader (i.e. the same cut will not appear twice in the same epoch).

By default, we "pack" the batches to minimize the amount of padding - we achieve that by concatenating the cuts' feature matrices with a small amount of silence (padding) in between.

Each item in this dataset is a dict of:

Dimension symbols legend: * B - batch size (number of Cuts) * S - number of supervision segments (greater or equal to B, as each Cut may have multiple supervisions) * T - number of frames of the longest Cut * F - number of features

The 'sequence idx' field is the index of the Cut used to create the example in the Dataset.

```
__init__(cuts, max_frames=26000, max_cuts=None, shuffle=False, concat_cuts=True, con-
cat_cuts_gap=1.0, concat_cuts_duration_factor=2)
K2 ASR IterableDataset constructor.
```

Parameters

- cuts (CutSet) the CutSet to sample data from.
- max_frames (int) The maximum number of feature frames that we're going to put in a single batch. The padding frames do not contribute to that limit, since we pack the batch by default to minimze the amount of padding.
- max_cuts (Optional[int]) The maximum number of cuts sampled to form a minibatch. By default, this constraint is off.
- **shuffle** (bool) When True, the cuts will be shuffled at the start of iteration. Convenient when mini-batch loop is inside an outer epoch-level loop, e.g.: *for epoch in range(10): for batch in dataset:* ... as every epoch will see a different cuts order.
- **concat_cuts** (bool) When True, we will concatenate the cuts to minimize the total amount of padding; e.g. instead of creating a batch with 40 examples, we will merge some of the examples together adding some silence between them to avoid a large number of padding frames that waste the computation. Enabled by default.
- **concat_cuts_gap** (float) The duration of silence in seconds that is inserted between the cuts; it's goal is to let the model "know" that there are separate utterances in a single example.
- concat_cuts_duration_factor(float) Determines the maximum duration of the concatenated cuts; by default it's twice the duration of the longest cut in the batch.

lhotse.dataset.speech recognition.concat cuts(cuts, gap=1.0, max duration=None)

We're going to concatenate the cuts to minimize the amount of total padding frames used. This is actually solving a knapsack problem. In this initial implementation we're using a greedy approach: going from the back (i.e. the shortest cuts) we'll try to concat them to the longest cut that still has some "space" at the end.

Parameters

- cuts (List[Union[Cut, MixedCut, PaddingCut]]) a list of cuts to pack.
- gap (float) the duration of silence inserted between concatenated cuts.
- max_duration (Optional[float]) the maximum duration for the concatenated cuts (by default set to the duration of the first cut).

:return a list of packed cuts.

```
Return type List[Union[Cut, MixedCut, PaddingCut]]
```

class lhotse.dataset.speech_recognition.**K2SpeechRecognitionDataset** (*cuts*)

The PyTorch Dataset for the speech recognition task using K2 library. Each item in this dataset is a dict of:

The 'sequence_idx' field is the index of the Cut used to create the example in the Dataset. It is mapped to the batch index later in the DataLoader.

```
___init___(cuts)
```

Initialize self. See help(type(self)) for accurate signature.

```
class lhotse.dataset.speech_recognition.K2DataLoader(*args, **kwds)
```

A PyTorch DataLoader that has a custom collate_fn that complements the K2SpeechRecognitionDataset.

The 'features' tensor is collated in a standard way to return a tensor of shape (B, T, F).

The 'supervisions' dict contains the same fields as in K2SpeechRecognitionDataset, except that each sub-field (like 'start_frame') is a 1D PyTorch tensor with shape (B,). The 'text' sub-field is an exception - it's a list of strings with length equal to batch size.

The 'sequence_idx' sub-field in 'supervisions', which originally points to index of the example in the Dataset, is remapped to the index of the corresponding features matrix in the collated 'features'. Multiple supervisions coming from the same cut will share the same 'sequence idx'.

```
For an example, see test/dataset/test_speech_recognition_dataset.

py::test_k2_dataloader().

__init___(*args, **kwargs)
    Initialize self. See help(type(self)) for accurate signature.
```

dataset

batch_size

num_workers

```
pin_memory
drop_last
timeout
sampler
prefetch_factor
```

 $\label{local_continuity} \begin{tabular}{ll} \textbf{lhotse.dataset.speech_recognition.multi_supervision_collate_fn} \end{tabular} \begin{tabular}{ll} \textbf{custom collate_fn for K2SpeechRecognitionDataset.} \end{tabular}$

It merges the items provided by K2SpeechRecognitionDataset into the following structure:

Dimension symbols legend: *B - batch size (number of Cuts), *S - number of supervision segments (greater or equal to B, as each Cut may have multiple supervisions), *T - number of frames of the longest Cut *F - number of features

Return type Dict

```
lhotse.dataset.speech_synthesis
   alias of lhotse.dataset.speech_synthesis
```

mixtures_set, nonsources_set=Nor

A PyTorch Dataset for the source separation task. It's created from a number of CutSets:

- sources_set: provides the audio cuts for the sources that (the targets of source separation),
- mixtures_set: provides the audio cuts for the signal mix (the input of source separation),
- nonsources_set: (optional) provides the audio cuts for other signals that are in the mix, but are not the targets of source separation. Useful for adding noise.

When queried for data samples, it returns a dict of:

```
'sources': (N x T x F) tensor,
'mixture': (T x F) tensor,
'real_mask': (N x T x F) tensor,
'binary_mask': (T x F) tensor
}
```

This Dataset performs on-the-fly feature-domain mixing of the sources. It expects the mixtures_set to contain MixedCuts, so that it knows which Cuts should be mixed together.

```
__init__ (sources_set, mixtures_set, nonsources_set=None)
Initialize self. See help(type(self)) for accurate signature.
```

tures_set)

A PyTorch Dataset for the source separation task. It's created from two CutSets - one provides the audio cuts for the sources, and the other one the audio cuts for the signal mix. When queried for data samples, it returns a dict of:

```
{
    'sources': (N x T x F) tensor,
    'mixture': (T x F) tensor,
    'real_mask': (N x T x F) tensor,
    'binary_mask': (T x F) tensor
}
```

It expects both CutSets to return regular Cuts, meaning that the signals were mixed in the time domain. In contrast to DynamicallyMixedSourceSeparationDataset, no on-the-fly feature-domain-mixing is performed.

```
__init__(sources_set, mixtures_set)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.dataset.vad.VadDataset (cuts)
```

The PyTorch Dataset for the voice activity detection task. Each item in this dataset is a dict of:

```
{
    'features': (T x F) tensor
    'is_voice': (T x 1) tensor
}
```

```
___init___(cuts)
```

Initialize self. See help(type(self)) for accurate signature.

CHAPTER

SEVEN

KALDI INTEROPERABILITY

We support importing Kaldi data directories that contain at least the wav.scp file, required to create the RecordingSet. Other files, such as segments, utt2spk, etc. are used to create the SupervisionSet.

We currently do not support the following (but may start doing so in the future):

- Importing Kaldi's extracted features (feats.scp is ignored)
- Exporting Lhotse manifests as Kaldi data directories.

7.1 Python

Python methods related to Kaldi support:

```
lhotse.kaldi.load_kaldi_data_dir(path, sampling_rate)
```

Load a Kaldi data directory and convert it to a Lhotse RecordingSet and SupervisionSet manifests. For this to work, at least the wav.scp file must exist. SupervisionSet is created only when a segments file exists. All the other files (text, utt2spk, etc.) are optional, and some of them might not be handled yet. In particular, feats.scp files are ignored.

Return type Tuple[RecordingSet, Optional[SupervisionSet]]

lhotse.kaldi.load_kaldi_text_mapping(path, must_exist=False)

Load Kaldi files such as utt2spk, spk2gender, text, etc. as a dict.

Return type Dict[str, Optional[str]]

7.2 CLI

Converting Kaldi data directory called data/train, with 16kHz sampling rate recordings, to a directory with Lhotse manifests called train_manifests:

lhotse convert-kaldi data/train 16000 train_manifests

CHAPTER

EIGHT

COMMAND-LINE INTERFACE

8.1 Ihotse obtain

Command group for download and extract data.

lhotse obtain [OPTIONS] COMMAND [ARGS]...

8.1.1 heroico

heroico download.

lhotse obtain heroico [OPTIONS] TARGET_DIR

Arguments

TARGET_DIR

Required argument

8.1.2 librimix

Mini LibriMix download.

lhotse obtain librimix [OPTIONS] TARGET_DIR

Arguments

TARGET_DIR

Required argument

8.1.3 mini-librispeech

Mini Librispeech download.

lhotse obtain mini-librispeech [OPTIONS] TARGET_DIR

Arguments

TARGET_DIR

Required argument

8.1.4 tedlium

TED-LIUM v3 download (approx. 11GB).

lhotse obtain tedlium [OPTIONS] TARGET_DIR

Arguments

TARGET_DIR

Required argument

8.2 Ihotse prepare

Command group with data preparation recipes.

lhotse prepare [OPTIONS] COMMAND [ARGS]...

8.2.1 broadcast-news

English Broadcast News 1997 data preparation. It will output three manifests: for recordings, topic sections, and speech segments. It supports the following LDC distributions:

* 1997 English Broadcast News Train (HUB4)

Speech LDC98S71

Transcripts LDC98T28

This data is not available for free - your institution needs to have an LDC subscription.

lhotse prepare broadcast-news [OPTIONS] AUDIO_DIR TRANSCRIPT_DIR OUTPUT_DIR

Arguments

AUDIO DIR

Required argument

TRANSCRIPT_DIR

Required argument

OUTPUT_DIR

Required argument

8.2.2 heroico

heroico Answers ASR data preparation.

lhotse prepare heroico [OPTIONS] SPEECH_DIR TRANSCRIPT_DIR OUTPUT_DIR

Arguments

SPEECH_DIR

Required argument

TRANSCRIPT_DIR

Required argument

OUTPUT_DIR

Required argument

8.2.3 librimix

LibrMix source separation data preparation.

```
lhotse prepare librimix [OPTIONS] LIBRIMIX_CSV OUTPUT_DIR
```

Options

```
--sampling-rate <sampling_rate>
```

Sampling rate to set in the RecordingSet manifest.

--min-segment-seconds <min_segment_seconds>

Remove segments shorter than MIN_SEGMENT_SECONDS.

$--with-{\tt precomputed-mixtures}, \ --{\tt no-precomputed-mixtures}$

Optionally create an RecordingSet manifest including the precomputed LibriMix mixtures.

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Arguments

LIBRIMIX CSV

Required argument

OUTPUT_DIR

Required argument

8.2.4 mini-librispeech

Mini Librispeech ASR data preparation.

lhotse prepare mini-librispeech [OPTIONS] CORPUS_DIR OUTPUT_DIR

Arguments

CORPUS_DIR

Required argument

OUTPUT DIR

Required argument

8.2.5 switchboard

The Switchboard corpus preparation.

This is conversational telephone speech collected as 2-channel, 8kHz-sampled data. We are using just the Switchboard-1 Phase 1 training data.

The catalog number LDC97S62 (Switchboard-1 Release 2) corresponds, we believe, to what we have. We also use the Mississippi State transcriptions, which we download separately from http://www.isip.piconepress.com/projects/switchboard/releases/switchboard_word_alignments.tar.gz

This data is not available for free - your institution needs to have an LDC subscription.

lhotse prepare switchboard [OPTIONS] AUDIO_DIR OUTPUT_DIR

Options

```
--transcript-dir <transcript_dir>
--sentiment-dir <sentiment_dir>
    Optional path to LDC2020T14 package with sentiment annotations for SWBD.
--omit-silence, --retain-silence
```

Should the [silence] segments be kept.

Arguments

AUDIO DIR

Required argument

OUTPUT_DIR

Required argument

8.2.6 tedlium

TED-LIUM v3 recording and supervision manifest preparation.

```
lhotse prepare tedlium [OPTIONS] TEDLIUM_DIR OUTPUT_DIR
```

Arguments

TEDLIUM_DIR

Required argument

OUTPUT_DIR

Required argument

8.3 Ihotse cut

Group of commands used to create CutSets.

```
lhotse cut [OPTIONS] COMMAND [ARGS]...
```

8.3.1 append

Create a new CutSet by appending the cuts in CUT_MANIFESTS. CUT_MANIFESTS are iterated position-wise (the cuts on i'th position in each manfiest are appended to each other). The cuts are appended in the order in which they appear in the input argument list. If CUT_MANIFESTS have different lengths, the script stops once the shortest CutSet is depleted.

```
lhotse cut append [OPTIONS] [CUT_MANIFESTS]... OUTPUT_CUT_MANIFEST
```

Arguments

CUT_MANIFESTS

Optional argument(s)

OUTPUT_CUT_MANIFEST

Required argument

8.3. Ihotse cut

8.3.2 mix-by-recording-id

Create a CutSet stored in OUTPUT_CUT_MANIFEST by matching the Cuts from CUT_MANIFESTS by their recording IDs and mixing them together.

Arguments

CUT MANIFESTS

Optional argument(s)

OUTPUT CUT MANIFEST

Required argument

8.3.3 mix-sequential

Create a CutSet stored in OUTPUT_CUT_MANIFEST by iterating jointly over CUT_MANIFESTS and mixing the Cuts on the same positions. E.g. the first output cut is created from the first cuts in each input manifest. The mix is performed by summing the features from all Cuts. If the CUT_MANIFESTS have different number of Cuts, the mixing ends when the shorter manifest is depleted.

```
lhotse cut mix-sequential [OPTIONS] [CUT_MANIFESTS]... OUTPUT_CUT_MANIFEST
```

Arguments

CUT MANIFESTS

Optional argument(s)

OUTPUT_CUT_MANIFEST

Required argument

8.3.4 pad

Create a new CutSet by padding the cuts in CUT_MANIFEST. The cuts will be right-padded, i.e. the padding is placed after the signal ends.

```
lhotse cut pad [OPTIONS] CUT_MANIFEST OUTPUT_CUT_MANIFEST
```

Options

-d, --duration <duration>

Desired duration of cuts after padding. Cuts longer than this won't be affected. By default, pad to the longest cut duration found in CUT_MANIFEST.

Arguments

CUT MANIFEST

Required argument

OUTPUT_CUT_MANIFEST

Required argument

8.3.5 random-mixed

Create a CutSet stored in OUTPUT_CUT_MANIFEST that contains supervision regions from SUPERVI-SION_MANIFEST and features supplied by FEATURE_MANIFEST. It first creates a trivial CutSet, splits it into two equal, randomized parts and mixes their features. The parameters of the mix are controlled via SNR_RANGE and OFFSET RANGE.

Options

-s, --snr-range <snr_range>

Range of SNR values (in dB) that will be uniformly sampled in order to mix the signals.

-o, --offset-range <offset_range>

Range of relative offset values (0 - 1), which will offset the "right" signal by this many times the duration of the "left" signal. It is uniformly sampled for each mix operation.

Arguments

SUPERVISION MANIFEST

Required argument

FEATURE_MANIFEST

Required argument

OUTPUT_CUT_MANIFEST

Required argument

8.3.6 simple

Create a CutSet stored in OUTPUT_CUT_MANIFEST. Depending on the provided options, it may contain any combination of recording, feature and supervision manifests. Either RECORDING_MANIFEST or FEATURE_MANIFEST has to be provided. When SUPERVISION_MANIFEST is provided, the cuts time span will correspond to that of the supervision segments. Otherwise, that time span corresponds to the one found in features, if available, otherwise recordings.

lhotse cut simple [OPTIONS] OUTPUT_CUT_MANIFEST

8.3. Ihotse cut 35

Options

- -r, --recording-manifest <recording_manifest>
 Optional recording manifest will be used to attach the recordings to the cuts.
- -f, --feature-manifest <feature_manifest>
 Optional feature manifest will be used to attach the features to the cuts.
- -s, --supervision_manifest < supervision_manifest>
 Optional supervision manifest will be used to attach the supervisions to the cuts.

Arguments

OUTPUT_CUT_MANIFEST

Required argument

8.3.7 truncate

Truncate the cuts in the CUT_MANIFEST and write them to OUTPUT_CUT_MANIFEST. Cuts shorter than MAX_DURATION will not be modified.

lhotse cut truncate [OPTIONS] CUT_MANIFEST OUTPUT_CUT_MANIFEST

Options

--preserve-id

Should the cuts preserve IDs (by default, they will get new, random IDs)

-d, --max-duration <max_duration>

The maximum duration in seconds of a cut in the resulting manifest. [required]

-o, --offset-type <offset_type>

Where should the truncated cut start: "start" - at the start of the original cut, "end" - MAX_DURATION before the end of the original cut, "random" - randomly choose somewhere between "start" and "end" options.

Options startlendlrandom

--keep-overflowing-supervisions, --discard-overflowing-supervisions

When a cut is truncated in the middle of a supervision segment, should the supervision be kept.

Arguments

CUT_MANIFEST

Required argument

OUTPUT_CUT_MANIFEST

Required argument

8.3.8 windowed

Create a CutSet stored in OUTPUT_CUT_MANIFEST from feature regions in FEATURE_MANIFEST. The feature matrices are traversed in windows with CUT_SHIFT increments, creating cuts of constant CUT_DURATION.

lhotse cut windowed [OPTIONS] FEATURE_MANIFEST OUTPUT_CUT_MANIFEST

Options

- -d, --cut-duration <cut_duration>
 How long should the cuts be in seconds.
- -s, --cut-shift <cut_shift>
 How much to shift the cutting window in seconds (by default the shift is equal to CUT_DURATION).
- --keep-shorter-windows, --discard-shorter-windows

When true, the last window will be used to create a Cut even if its duration is shorter than CUT_DURATION.

Arguments

FEATURE MANIFEST

Required argument

OUTPUT CUT MANIFEST

Required argument

8.4 Ihotse manifest

Generic commands working with all or most manifest types.

lhotse manifest [OPTIONS] COMMAND [ARGS]...

8.4.1 combine

Load MANIFESTS, combine them into a single one, and write it to OUTPUT_MANIFEST.

lhotse manifest combine [OPTIONS] [MANIFESTS]... OUTPUT_MANIFEST

Arguments

MANIFESTS

Optional argument(s)

OUTPUT_MANIFEST

Required argument

8.4. Ihotse manifest 37

8.4.2 filter

Filter a MANIFEST according to the rule specified in PREDICATE, and save the result to OUTPUT_MANIFEST. It is intended to work generically with most manifest types - it supports RecordingSet, SupervisionSet and CutSet.

The PREDICATE specifies which attribute is used for item selection. Some examples:

lhotse manifest filter 'duration>4.5' supervision.json output.json

lhotse manifest filter 'num_frames<600' cuts.json output.json

lhotse manifest filter 'start=0' cuts.json output.json

lhotse manifest filter 'channel!=0' audio.json output.json

It currently only supports comparison of numerical manifest item attributes, such as: start, duration, end, channel, num_frames, num_features, etc.

lhotse manifest filter [OPTIONS] PREDICATE MANIFEST OUTPUT_MANIFEST

Arguments

PREDICATE

Required argument

MANIFEST

Required argument

OUTPUT MANIFEST

Required argument

8.4.3 split

Load MANIFEST, split it into NUM_SPLITS equal parts and save as separate manifests in OUTPUT_DIR.

lhotse manifest split [OPTIONS] NUM_SPLITS MANIFEST OUTPUT_DIR

Options

--randomize

Optionally randomize the sequence before splitting.

Arguments

NUM_SPLITS

Required argument

MANIFEST

Required argument

OUTPUT_DIR

Required argument

8.5 Ihotse feat

Feature extraction related commands.

```
lhotse feat [OPTIONS] COMMAND [ARGS]...
```

8.5.1 extract

Extract features for recordings in a given AUDIO_MANIFEST. The features are stored in OUTPUT_DIR, with one file per recording (or segment).

```
lhotse feat extract [OPTIONS] RECORDING_MANIFEST OUTPUT_DIR
```

Options

-a, --augmentation <augmentation>

Optional time-domain data augmentation effect chain to apply.

Options pitch|speed|reverb|pitch_reverb_tdrop

-f, --feature-manifest <feature_manifest>

Optional manifest specifying feature extractor configuration.

```
--storage-type <storage_type>
```

Select a storage backend for the feature matrices.

Options lilcom_files|lilcom_hdf5|numpy_files|numpy_hdf5

-t, --lilcom-tick-power <lilcom_tick_power>

Determines the compression accuracy; the input will be compressed to integer multiples of 2^tick_power

-r, --root-dir <root_dir>

Root directory - all paths in the manifest will use this as prefix.

-j, --num-jobs <num_jobs>

Number of parallel processes.

Arguments

RECORDING_MANIFEST

Required argument

OUTPUT_DIR

Required argument

8.5. Ihotse feat

8.5.2 write-default-config

Save a default feature extraction config to OUTPUT_CONFIG.

lhotse feat write-default-config [OPTIONS] OUTPUT_CONFIG

Options

-f, **--feature-type** <feature_type> Which feature extractor type to use.

Options fbanklmfcclspectrogram

Arguments

OUTPUT CONFIG

Required argument

8.6 Ihotse convert-kaldi

Convert a Kaldi data dir DATA_DIR into a directory MANIFEST_DIR of lhotse manifests. Ignores feats.scp. The SAMPLING_RATE has to be explicitly specified as it is not available to read from DATA_DIR.

lhotse convert-kaldi [OPTIONS] DATA_DIR SAMPLING_RATE MANIFEST_DIR

Arguments

DATA DIR

Required argument

SAMPLING_RATE

Required argument

MANIFEST_DIR

Required argument

CHAPTER

NINE

API REFERENCE

This page contains a comprehensive list of all classes and functions within *lhotse*.

9.1 Datasets

PyTorch Dataset wrappers for common tasks.

9.1.1 Speech Recognition

class lhotse.dataset.speech_recognition.**SpeechRecognitionDataset** (*cuts*)

The PyTorch Dataset for the speech recognition task. Each item in this dataset is a dict of:

```
{
   'features': (T x F) tensor,
   'text': string,
   'supervisions_mask': (T) tensor
}
```

The supervisions_mask field is a mask that specifies which frames are covered by a supervision by assigning a value of 1 (in this case: segments with transcribed speech contents), and which are not by asigning a value of 0 (in this case: padding, contextual noise, or in general the acoustic context without transcription).

In the future, will be extended by graph supervisions.

```
__init__(cuts)
Initialize self. See help(type(self)) for accurate signature.
```

class lhotse.dataset.speech_recognition.K2SpeechRecognitionIterableDataset(cuts,

```
max_frames=26000,
max_cuts=None,
shuf-
fle=False,
con-
cat_cuts=True,
con-
cat_cuts_gap=1.0,
con-
cat_cuts_duration_fact
```

The PyTorch Dataset for the speech recognition task using K2 library.

This dataset internally batches and collates the Cuts and should be used with PyTorch DataLoader with argument batch_size=None to work properly. The batch size is determined automatically to satisfy the constraints of max frames and max cuts.

This dataset will automatically partition itself when used with a multiprocessing DataLoader (i.e. the same cut will not appear twice in the same epoch).

By default, we "pack" the batches to minimize the amount of padding - we achieve that by concatenating the cuts' feature matrices with a small amount of silence (padding) in between.

Each item in this dataset is a dict of:

Dimension symbols legend: * B - batch size (number of Cuts) * S - number of supervision segments (greater or equal to B, as each Cut may have multiple supervisions) * T - number of frames of the longest Cut * F - number of features

The 'sequence idx' field is the index of the Cut used to create the example in the Dataset.

```
__init__(cuts, max_frames=26000, max_cuts=None, shuffle=False, concat_cuts=True, con-
cat_cuts_gap=1.0, concat_cuts_duration_factor=2)
K2 ASR IterableDataset constructor.
```

Parameters

- **cuts** (*CutSet*) the CutSet to sample data from.
- max_frames (int) The maximum number of feature frames that we're going to put in a single batch. The padding frames do not contribute to that limit, since we pack the batch by default to minimze the amount of padding.
- max_cuts (Optional[int]) The maximum number of cuts sampled to form a minibatch. By default, this constraint is off.
- **shuffle** (bool) When True, the cuts will be shuffled at the start of iteration. Convenient when mini-batch loop is inside an outer epoch-level loop, e.g.: *for epoch in range(10): for batch in dataset:* ... as every epoch will see a different cuts order.
- concat_cuts (bool) When True, we will concatenate the cuts to minimize the total amount of padding; e.g. instead of creating a batch with 40 examples, we will merge some of the examples together adding some silence between them to avoid a large number of padding frames that waste the computation. Enabled by default.
- **concat_cuts_gap** (float) The duration of silence in seconds that is inserted between the cuts; it's goal is to let the model "know" that there are separate utterances in a single example.
- **concat_cuts_duration_factor**(float) Determines the maximum duration of the concatenated cuts; by default it's twice the duration of the longest cut in the batch.

```
lhotse.dataset.speech_recognition.concat_cuts(cuts, gap=1.0, max_duration=None)
```

We're going to concatenate the cuts to minimize the amount of total padding frames used. This is actually solving a knapsack problem. In this initial implementation we're using a greedy approach: going from the back (i.e. the shortest cuts) we'll try to concat them to the longest cut that still has some "space" at the end.

Parameters

- cuts (List[Union[ForwardRef, ForwardRef, ForwardRef]]) a list of cuts to pack.
- gap (float) the duration of silence inserted between concatenated cuts.
- max_duration (Optional[float]) the maximum duration for the concatenated cuts (by default set to the duration of the first cut).

:return a list of packed cuts.

```
Return type List[Union[ForwardRef, ForwardRef, ForwardRef]]
```

class lhotse.dataset.speech_recognition.**K2SpeechRecognitionDataset** (*cuts*)

The PyTorch Dataset for the speech recognition task using K2 library. Each item in this dataset is a dict of:

The 'sequence_idx' field is the index of the Cut used to create the example in the Dataset. It is mapped to the batch index later in the DataLoader.

```
__init__ (cuts)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.dataset.speech_recognition.K2DataLoader(*args, **kwds)
```

A PyTorch DataLoader that has a custom collate fn that complements the K2SpeechRecognitionDataset.

The 'features' tensor is collated in a standard way to return a tensor of shape (B, T, F).

The 'supervisions' dict contains the same fields as in K2SpeechRecognitionDataset, except that each sub-field (like 'start_frame') is a 1D PyTorch tensor with shape (B,). The 'text' sub-field is an exception - it's a list of strings with length equal to batch size.

The 'sequence_idx' sub-field in 'supervisions', which originally points to index of the example in the Dataset, is remapped to the index of the corresponding features matrix in the collated 'features'. Multiple supervisions coming from the same cut will share the same 'sequence_idx'.

```
For an example, see test/dataset/test_speech_recognition_dataset.

py::test_k2_dataloader().

__init__(*args, **kwargs)
    Initialize self. See help(type(self)) for accurate signature.
```

dataset

batch_size

num_workers

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```
pin_memory
drop_last
timeout
sampler
prefetch_factor
```

 $\label{local_continuity} \begin{tabular}{ll} \textbf{lhotse.dataset.speech_recognition.multi_supervision_collate_fn} \end{tabular} \begin{tabular}{ll} \textbf{custom collate_fn for K2SpeechRecognitionDataset.} \end{tabular}$

It merges the items provided by K2SpeechRecognitionDataset into the following structure:

Dimension symbols legend: *B - batch size (number of Cuts), *S - number of supervision segments (greater or equal to B, as each Cut may have multiple supervisions), *T - number of frames of the longest Cut *F - number of features

Return type Dict

9.1.2 Source Separation

An abstract base class, implementing PyTorch Dataset for the source separation task. It's created from two CutSets - one provides the audio cuts for the sources, and the other one the audio cuts for the signal mix. When queried for data samples, it returns a dict of:

```
'sources': (N x T x F) tensor,

'mixture': (T x F) tensor,

'real_mask': (N x T x F) tensor,

'binary_mask': (T x F) tensor

}
```

```
__init__(sources_set, mixtures_set)
Initialize self. See help(type(self)) for accurate signature.
```

```
validate()
```

```
\textbf{class} \hspace{0.1in} \textbf{lhotse.dataset.source\_separation.DynamicallyMixedSourceSeparationDataset} \hspace{0.1in} (sources\_set, \\ \hspace{0.1in} \textit{mix-}
```

tures_set,
non-

sources_set=Nor

A PyTorch Dataset for the source separation task. It's created from a number of CutSets:

- sources_set: provides the audio cuts for the sources that (the targets of source separation),
- mixtures_set: provides the audio cuts for the signal mix (the input of source separation),
- nonsources_set: (optional) provides the audio cuts for other signals that are in the mix, but are not the targets of source separation. Useful for adding noise.

When queried for data samples, it returns a dict of:

```
'sources': (N x T x F) tensor,
'mixture': (T x F) tensor,
'real_mask': (N x T x F) tensor,
'binary_mask': (T x F) tensor
}
```

This Dataset performs on-the-fly feature-domain mixing of the sources. It expects the mixtures_set to contain MixedCuts, so that it knows which Cuts should be mixed together.

```
__init__ (sources_set, mixtures_set, nonsources_set=None)
Initialize self. See help(type(self)) for accurate signature.
```

tures_set)

A PyTorch Dataset for the source separation task. It's created from two CutSets - one provides the audio cuts for the sources, and the other one the audio cuts for the signal mix. When queried for data samples, it returns a dict of:

```
'sources': (N x T x F) tensor,
'mixture': (T x F) tensor,
'real_mask': (N x T x F) tensor,
'binary_mask': (T x F) tensor
}
```

It expects both CutSets to return regular Cuts, meaning that the signals were mixed in the time domain. In contrast to DynamicallyMixedSourceSeparationDataset, no on-the-fly feature-domain-mixing is performed.

```
__init__(sources_set, mixtures_set)
Initialize self. See help(type(self)) for accurate signature.
```

9.1.3 Unsupervised

```
class lhotse.dataset.unsupervised.UnsupervisedDataset(cuts)
```

Dataset that contains no supervision - it only provides the features extracted from recordings. The returned features are a torch. Tensor of shape $(T \times F)$, where T is the number of frames, and F is the feature dimension.

```
__init__(cuts)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.dataset.unsupervised.UnsupervisedWaveformDataset(cuts)
```

A variant of UnsupervisedDataset that provides waveform samples instead of features. The output is a tensor of shape (C, T), with C being the number of channels and T the number of audio samples. In this implemenation, there will always be a single channel.

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class lhotse.dataset.unsupervised.DynamicUnsupervisedDataset ($feature_extractor$, $extit{cuts}$, $extit{aug-ment fn=None}$)

An example dataset that shows how to use on-the-fly feature extraction in Lhotse. It accepts two additional inputs - a FeatureExtractor and an optional WavAugmenter for time-domain data augmentation.. The output is approximately the same as that of the UnsupervisedDataset - there might be slight differences for MixedCut``s, because this dataset mixes them in the time domain, and ``UnsupervisedDataset does that in the feature domain. Cuts that are not mixed will yield identical results in both dataset classes.

```
__init__ (feature_extractor, cuts, augment_fn=None)
Initialize self. See help(type(self)) for accurate signature.
```

9.1.4 Voice Activity Detection

class lhotse.dataset.vad.VadDataset(cuts)

The PyTorch Dataset for the voice activity detection task. Each item in this dataset is a dict of:

```
{
    'features': (T x F) tensor
    'is_voice': (T x 1) tensor
}
```

```
__init___(cuts)
```

Initialize self. See help(type(self)) for accurate signature.

9.1.5 Diarization (experimental)

A PyTorch Dataset for the speaker diarization task. Our assumptions about speaker diarization are the following:

- we assume a single channel input (for now), which could be either a true mono signal or a beamforming result from a microphone array.
- we assume that the supervision used for model training is a speech activity matrix, with one row
 dedicated to each speaker (either in the current cut or the whole dataset, depending on the settings). The columns correspond to feature frames. Each row is effectively a Voice Activity
 Detection supervision for a single speaker. This setup is somewhat inspired by the TS-VAD paper:
 https://arxiv.org/abs/2005.07272

Each item in this dataset is a dict of:

```
{
    'features': (T x F) tensor
    'speaker_activity': (num_speaker x T) tensor
}
```

Constructor arguments:

Parameters

- cuts (CutSet) a CutSet used to create the dataset object.
- min_speaker_dim(Optional[int]) optional int, when specified it will enforce that the matrix shape is at least that value (useful for datasets like CHiME 6 where the number of speakers is always 4, but some cuts might have less speakers than that).

- **global_speaker_ids** (bool) a bool, indicates whether the same speaker should always retain the same row index in the speaker activity matrix (useful for speaker-dependent systems)
- **root_dir** a prefix path to be attached to the feature files paths.

```
__init__(cuts, min_speaker_dim=None, global_speaker_ids=False)
Initialize self. See help(type(self)) for accurate signature.
```

9.2 Recording manifests

Data structures used for describing audio recordings in a dataset.

```
class lhotse.audio.AudioSource(type: str, channels: List[int], source: str)
     AudioSource represents audio data that can be retrieved from somewhere. Supported sources of audio are
     currently: - 'file' (formats supported by librosa, possibly multi-channel) - 'command' [unix pipe] (must be
     WAVE, possibly multi-channel)
     type:
             str
     channels:
                   List[int]
     source:
                str
     load_audio (offset_seconds=0.0, duration_seconds=None)
          Load the AudioSource (both files and commands) with librosa, accounting for many audio formats and
          multi-channel inputs. Returns numpy array with shapes: (n_samples) for single-channel, (n_channels,
          n_samples) for multi-channel.
              Return type ndarray
     with_path_prefix(path)
              Return type AudioSource
     static from_dict(data)
              Return type AudioSource
     __init__ (type, channels, source)
          Initialize self. See help(type(self)) for accurate signature.
lhotse.audio.read_audio(path, offset, duration)
          Return type Tuple[ndarray, int]
class lhotse.audio.Recording(id: str, sources: List[lhotse.audio.AudioSource], sampling_rate:
                                     int, num samples: int, duration: float)
     Recording represents an AudioSource along with some metadata.
     id:
           str
     sources: List[AudioSource]
     sampling_rate:
                          int
     num samples: int
     duration: Seconds
     static from_sphere(sph_path, relative_path_depth=None)
```

Read a SPHERE file's header and create the corresponding Recording.

Parameters

- **sph_path** (Union[Path, str]) Path to the sphere (.sph) file.
- relative_path_depth (Optional[int]) optional int specifying how many last parts of the file path should be retained in the AudioSource. By default writes the path as is.

Return type Recording

Returns a new Recording instance pointing to the sphere file.

class lhotse.audio.RecordingSet(*args, **kwds)

Initialize self. See help(type(self)) for accurate signature.

RecordingSet represents a dataset of recordings. It does not contain any annotation - just the information needed to retrieve a recording (possibly multi-channel, from files or from shell commands and pipes) and some metadata for each of them.

It also supports (de)serialization to/from YAML and takes care of mapping between rich Python classes and YAML primitives during conversion.

Return a new RecordingSet with the Recordings that satisfy the *predicate*.

Parameters predicate (Callable[[Recording], bool]) – a function that takes a recording as an argument and returns bool.

```
Return type RecordingSet
Returns a filtered RecordingSet.
```

split (num_splits, randomize=False)

Split the RecordingSet into num_splits pieces of equal size.

Parameters

• num_splits (int) - Requested number of splits.

• randomize (bool) – Optionally randomize the recordings order first.

Return type List[RecordingSet]

Returns A list of RecordingSet pieces.

load_audio (recording_id, channels=None, offset_seconds=0.0, duration_seconds=None)

Return type ndarray

with path prefix (path)

Return type RecordingSet

num_channels(recording_id)

Return type int

sampling_rate(recording_id)

Return type int

num_samples(recording_id)

Return type int

duration(recording_id)

Return type float

___init___(recordings)

Initialize self. See help(type(self)) for accurate signature.

class lhotse.audio.AudioMixer(base audio, sampling rate)

Utility class to mix multiple waveforms into a single one. It should be instantiated separately for each mixing session (i.e. each MixedCut will create a separate AudioMixer to mix its tracks). It is initialized with a numpy array of audio samples (typically float32 in [-1, 1] range) that represents the "reference" signal for the mix. Other signals can be mixed to it with different time offsets and SNRs using the add_to_mix method. The time offset is relative to the start of the reference signal (only positive values are supported). The SNR is relative to the energy of the signal used to initialize the AudioMixer.

```
__init__ (base_audio, sampling_rate)
```

Parameters

- base_audio (ndarray) A numpy array with the audio samples for the base signal (all the other signals will be mixed to it).
- sampling_rate (int) Sampling rate of the audio.

property unmixed audio

Return a numpy ndarray with the shape (num_tracks, num_samples), where each track is zero padded and scaled adequately to the offsets and SNR used in add_to_mix call.

Return type ndarray

property mixed_audio

Return a numpy ndarray with the shape (1, num_samples) - a mono mix of the tracks supplied with add_to_mix calls.

Return type ndarray

add_to_mix (audio, snr=None, offset=0.0)

Add audio (only support mono-channel) of a new track into the mix. :type audio: ndarray :param audio: An array of audio samples to be mixed in. :type snr: Optional[float] :param snr: Signal-to-noise ratio, assuming *audio* represents noise (positive SNR - lower *audio* energy, negative SNR - higher *audio*

energy) :type offset: float :param offset: How many seconds to shift audio in time. For mixing, the signal will be padded before the start with low energy values. :return:

```
lhotse.audio.audio_energy(audio)
        Return type float
```

9.3 Supervision manifests

Data structures used for describing supervisions in a dataset.

```
class lhotse.supervision.SupervisionSegment (id: str, recording_id: str, start: float, dura-
                                                    tion: float, channel: int = 0, text: Union[str, ]
                                                    NoneType] = None, language: Union[str,
                                                    NoneType] = None, speaker: Union[str,
                                                    NoneType] = None, gender:
                                                                               Union[str,
                                                    NoneType] = None, custom: Union[Dict[str,
                                                    Any], NoneType] = None)
    id:
          str
    recording_id: str
    start: Seconds
    duration:
                 Seconds
    channel: int = 0
    text: Optional[str] = None
    language: Optional[str] = None
    speaker:
                Optional[str] = None
    gender: Optional[str] = None
               Optional[Dict[str, Any]] = None
    custom:
    property end
            Return type float
    with offset (offset)
         Return an identical SupervisionSegment, but with the offset added to the start field.
```

```
Return type SupervisionSegment
```

trim(end)

Return an identical SupervisionSegment, but ensure that self.start is not negative (in which case it's set to 0) and self.end does not exceed the end parameter.

This method is useful for ensuring that the supervision does not exceed a cut's bounds, in which case pass cut.duration as the end argument, since supervision times are relative to the cut.

```
Return type SupervisionSegment
```

```
map (transform_fn)
```

Return a copy of the current segment, transformed with transform_fn.

```
Parameters transform_fn
                                           (Callable[[SupervisionSegment],
   SupervisionSegment]) - a function that takes a segment as input, transforms it
   and returns a new segment.
```

```
Return type SupervisionSegment
```

Returns a modified SupervisionSegment.

```
transform_text (transform_fn)
```

Return a copy of the current segment with transformed text field. Useful for text normalization, phonetic transcription, etc.

Parameters transform_fn (Callable[[str], str]) – a function that accepts a string and returns a string.

Return type SupervisionSegment

Returns a SupervisionSegment with adjusted text.

static from_dict(data)

Return type SupervisionSegment

__init__ (id, recording_id, start, duration, channel=0, text=None, language=None, speaker=None, gender=None, custom=None)

Initialize self. See help(type(self)) for accurate signature.

```
class lhotse.supervision.SupervisionSet(*args, **kwds)
```

SupervisionSet represents a collection of segments containing some supervision information. The only required fields are the ID of the segment, ID of the corresponding recording, and the start and duration of the segment in seconds. All other fields, such as text, language or speaker, are deliberately optional to support a wide range of tasks, as well as adding more supervision types in the future, while retaining backwards compatibility.

```
segments: Dict[str, SupervisionSegment]
```

static from_segments(segments)

Return type SupervisionSet

static from_dicts(data)

Return type SupervisionSet

to dicts()

Return type List[dict]

split (num_splits, randomize=False)

Split the SupervisionSet into num_splits pieces of equal size.

Parameters

- num_splits (int) Requested number of splits.
- randomize (bool) Optionally randomize the supervisions order first.

Return type List[SupervisionSet]

Returns A list of SupervisionSet pieces.

filter (predicate)

Return a new SupervisionSet with the SupervisionSegments that satisfy the *predicate*.

Parameters predicate (Callable[[SupervisionSegment], bool]) – a function that takes a supervision as an argument and returns bool.

Return type SupervisionSet

Returns a filtered SupervisionSet.

map (transform_fn)

Map a transform fn to the SupervisionSegments and return a new SupervisionSet.

Parameters transform fn

(Callable[[SupervisionSegment],

SupervisionSegment]) – a function that modifies a supervision as an argument.

Return type SupervisionSet

Returns a new SupervisionSet with modified segments.

transform_text (transform_fn)

Return a copy of the current SupervisionSet with the segments having a transformed text field. Useful for text normalization, phonetic transcription, etc.

Parameters transform_fn (Callable[[str], str]) – a function that accepts a string and returns a string.

Return type SupervisionSet

Returns a SupervisionSet with adjusted text.

find (recording_id, channel=None, start_after=0, end_before=None, adjust_offset=False)

Return an iterable of segments that match the provided recording_id.

Parameters

- recording_id (str) Desired recording ID.
- **channel** (Optional[int]) When specified, return supervisions in that channel otherwise, in all channels.
- **start_after** (float) When specified, return segments that start after the given value.
- end_before (Optional[float]) When specified, return segments that end before the given value.
- adjust_offset (bool) When true, return segments as if the recordings had started at start_after. This is useful for creating Cuts. Fom a user perspective, when dealing with a Cut, it is no longer helpful to know when the supervisions starts in a recording instead, it's useful to know when the supervision starts relative to the start of the Cut. In the anticipated use-case, start_after and end_before would be the beginning and end of a cut; this option converts the times to be relative to the start of the cut.

Return type Iterable[SupervisionSegment]

Returns An iterator over supervision segments satisfying all criteria.

__init__(segments, _segments_by_recording_id=None)
Initialize self. See help(type(self)) for accurate signature.

9.4 Feature extraction and manifests

Data structures and tools used for feature extraction and description.

9.4.1 Features API - extractor and manifests

class lhotse.features.base.FeatureExtractor(config=None)

The base class for all feature extractors in Lhotse. It is initialized with a config object, specific to a particular feature extraction method. The config is expected to be a dataclass so that it can be easily serialized.

All derived feature extractors must implement at least the following:

- a name class attribute (how are these features called, e.g. 'mfcc')
- a config_type class attribute that points to the configuration dataclass type
- the extract method,
- the frame_shift property.

Feature extractors that support feature-domain mixing should additionally specify two static methods:

- compute_energy, and
- mix.

By itself, the FeatureExtractor offers the following high-level methods that are not intended for overriding:

- extract_from_samples_and_store
- extract_from_recording_and_store

These methods run a larger feature extraction pipeline that involves data augmentation and disk storage.

```
name = None
config_type = None
__init___(config=None)
    Initialize self. See help(type(self)) for accurate signature.
```

abstract extract(samples, sampling rate)

Defines how to extract features using a numpy ndarray of audio samples and the sampling rate.

Return type ndarray

Returns a numpy ndarray representing the feature matrix.

```
abstract property frame_shift
```

Return type float

abstract feature_dim(sampling_rate)

Return type int

static mix (features_a, features_b, energy_scaling_factor_b)

Perform feature-domain mix of two singals, a and b, and return the mixed signal.

Parameters

- features_a (ndarray) Left-hand side (reference) signal.
- features b (ndarray) Right-hand side (mixed-in) signal.
- energy_scaling_factor_b (float) A scaling factor for features_b energy. It is used to achieve a specific SNR. E.g. to mix with an SNR of 10dB when both features_a and features_b energies are 100, the features_b signal energy needs to be scaled by 0.1. Since different features (e.g. spectrogram, fbank, MFCC) require different combination of transformations (e.g. exp, log, sqrt, pow) to allow mixing

of two signals, the exact place where to apply <code>energy_scaling_factor_b</code> to the signal is determined by the implementer.

Return type ndarray

Returns A mixed feature matrix.

static compute_energy (features)

Compute the total energy of a feature matrix. How the energy is computed depends on a particular type of features. It is expected that when implemented, compute energy will never return zero.

Parameters features (ndarray) - A feature matrix.

Return type float

Returns A positive float value of the signal energy.

```
extract_from_samples_and_store(samples, storage, sampling_rate, offset=0, aug-
ment_fn=None)
```

Extract the features from an array of audio samples in a full pipeline:

- optional audio augmentation;
- extract the features;
- save them to disk in a specified directory;
- return a Features object with a description of the extracted features.

Note, unlike in extract_from_recording_and_store, the returned Features object might not be suitable to store in a FeatureSet, as it does not reference any particular Recording. Instead, this method is useful when extracting features from cuts - especially MixedCut instances, which may be created from multiple recordings and channels.

Parameters

- samples (ndarray) a numpy ndarray with the audio samples.
- **sampling_rate** (int) integer sampling rate of samples.
- **storage** (FeaturesWriter) a FeaturesWriter object that will handle storing the feature matrices.
- offset (float) an offset in seconds for where to start reading the recording when used for Cut feature extraction, must be equal to Cut.start.
- augment_fn (Optional[Callable[[ndarray, int], ndarray]]) an optional WavAugmenter instance to modify the waveform before feature extraction.

Returns a Features manifest item for the extracted feature matrix (it is not written to disk).

extract_from_recording_and_store(recording, storage, offset=0, duration=None, channels=None, augment_fn=None)

Extract the features from a Recording in a full pipeline:

- load audio from disk;
- optionally, perform audio augmentation;
- extract the features;
- save them to disk in a specified directory;
- return a Features object with a description of the extracted features and the source data used.

Parameters

- recording (Recording) a Recording that specifies what's the input audio.
- **storage** (FeaturesWriter) a FeaturesWriter object that will handle storing the feature matrices.
- **offset** (float) an optional offset in seconds for where to start reading the recording.
- duration (Optional[float]) an optional duration specifying how much audio to load from the recording.
- **channels** (Union[int, List[int], None]) an optional int or list of ints, specifying the channels; by default, all channels will be used.
- augment_fn (Optional[Callable[[ndarray, int], ndarray]]) an optional WavAugmenter instance to modify the waveform before feature extraction.

Returns a Features manifest item for the extracted feature matrix.

```
classmethod from_dict(data)
    Return type FeatureExtractor
    classmethod from_yaml(path)
        Return type FeatureExtractor
    to_yaml(path)

lhotse.features.base.get_extractor_type(name)
```

Return the feature extractor type corresponding to the given name.

Parameters name (str) – specifies which feature extractor should be used.

Return type Type

Returns A feature extractors type.

```
lhotse.features.base.create_default_feature_extractor(name)
```

Create a feature extractor object with a default configuration.

Parameters name (str) – specifies which feature extractor should be used.

Return type Optional[FeatureExtractor]

Returns A new feature extractor instance.

```
lhotse.features.base.register_extractor(cls)
```

This decorator is used to register feature extractor classes in Lhotse so they can be easily created just by knowing their name.

An example of usage:

@register_extractor class MyFeatureExtractor: . . .

Parameters cls – A type (class) that is being registered.

Returns Registered type.

```
class lhotse.features.base.TorchaudioFeatureExtractor(config=None)
```

Common abstract base class for all torchaudio based feature extractors.

```
feature_fn = None
```

extract (samples, sampling_rate)

Defines how to extract features using a numpy ndarray of audio samples and the sampling rate.

Return type ndarray

```
Returns a numpy ndarray representing the feature matrix.
```

```
property frame_shift

Return type float
```

Represents features extracted for some particular time range in a given recording and channel. It contains metadata about how it's stored: storage_type describes "how to read it", for now it supports numpy arrays serialized with np.save, as well as arrays compressed with lilcom; storage_path is the path to the file on the local filesystem.

```
type:
      str
num frames:
               int
num features:
sampling_rate:
                  int
start: Seconds
duration:
            Seconds
storage_type:
                 str
storage_path:
                 str
storage_key:
                str
recording_id: Optional[str] = None
channels: Optional[Union[int, List[int]]] = None
property end
        Return type float
property frame_shift
        Return type float
load (start=None, duration=None)
        Return type ndarray
with_path_prefix(path)
        Return type Features
static from_dict(data)
        Return type Features
 __init___(type, num_frames, num_features, sampling_rate, start, duration, storage_type, storage_path,
          storage key, recording id=None, channels=None)
    Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.features.base.FeatureSet (*args, **kwds)
```

Represents a feature manifest, and allows to read features for given recordings within particular channels and time ranges. It also keeps information about the feature extractor parameters used to obtain this set. When a given recording/time-range/channel is unavailable, raises a KeyError.

```
features: List[Features]
```

```
static from_features (features)
    Return type FeatureSet

static from_dicts (data)
    Return type FeatureSet

to_dicts()
    Return type List[dict]

with_path_prefix (path)
    Return type FeatureSet

split (num_splits, randomize=False)
    Split the FeatureSet into num_splits pieces of equal size.
```

Parameters

- num_splits (int) Requested number of splits.
- randomize (bool) Optionally randomize the features order first.

```
Return type List[FeatureSet]
```

Returns A list of FeatureSet pieces.

find (recording_id, channel_id=0, start=0.0, duration=None, leeway=0.05)

Find and return a Features object that best satisfies the search criteria. Raise a KeyError when no such object is available.

Parameters

- recording_id (str) str, requested recording ID.
- **channel_id** (int) int, requested channel.
- **start** (float) float, requested start time in seconds for the feature chunk.
- **duration** (Optional[float]) optional float, requested duration in seconds for the feature chunk. By default, return everything from the start.
- **leeway** (float) float, controls how strictly we have to match the requested start and duration criteria. It is necessary to keep a small positive value here (default 0.05s), as there might be differences between the duration of recording/supervision segment, and the duration of features. The latter one is constrained to be a multiple of frame_shift, while the former can be arbitrary.

Return type Features

Returns a Features object satisfying the search criteria.

```
load (recording_id, channel_id=0, start=0.0, duration=None)
```

Find a Features object that best satisfies the search criteria and load the features as a numpy ndarray. Raise a KeyError when no such object is available.

```
Return type ndarray
```

```
__init__(features=<factory>, _features_by_recording_id=None)
Initialize self. See help(type(self)) for accurate signature.
```

```
class lhotse.features.base.FeatureSetBuilder(feature_extractor, storage, ment_fn=None)
```

An extended constructor for the FeatureSet. Think of it as a class wrapper for a feature extraction script. It

consumes an iterable of Recordings, extracts the features specified by the FeatureExtractor config, and saves stores them on the disk.

Eventually, we plan to extend it with the capability to extract only the features in specified regions of recordings and to perform some time-domain data augmentation.

Store feats array on disk, using lilcom compression by default.

Parameters

- **feats** (ndarray) a numpy ndarray containing features.
- storage (FeaturesWriter) a FeaturesWriter object to use for array storage.

Return type str

Returns a path to the file containing the stored array.

9.4.2 Torchaudio feature extractors

```
class lhotse.features.fbank.FbankConfig (dither: float = 0.0, window type: str = 'povey',
                                                            float = 0.025, frame\_shift:
                                              frame_length:
                                              float = 0.01, remove\_dc\_offset: bool = True,
                                              round_to_power_of_two: bool = True, en-
                                              ergy_floor: float = 1e-10, min_duration: float
                                              = 0.0, preemphasis_coefficient: float = 0.97,
                                              raw_energy: bool = True, low_freq: float = 20.0,
                                              high_freq: float = - 400.0, num_mel_bins: int =
                                              40, use_energy: bool = False, vtln_low: float =
                                              100.0, vtln_high: float = - 500.0, vtln_warp: float
                                              = 1.0)
    dither: float = 0.0
    window_type: str = 'povey'
    frame_length: float = 0.025
    frame shift: float = 0.01
    remove_dc_offset: bool = True
    round_to_power_of_two: bool = True
    energy_floor: float = 1e-10
    min_duration: float = 0.0
    preemphasis_coefficient: float = 0.97
    raw_energy: bool = True
    low freq: float = 20.0
    high_freq: float = -400.0
```

class lhotse.features.fbank.Fbank(config=None)

Log Mel energy filter bank feature extractor based on torchaudio.compliance.kaldi.fbank function.

```
name = 'fbank'
config_type
    alias of FbankConfig
feature_dim(sampling_rate)
    Return type int
```

static mix (features_a, features_b, energy_scaling_factor_b)

Perform feature-domain mix of two singals, a and b, and return the mixed signal.

Parameters

- features_a (ndarray) Left-hand side (reference) signal.
- **features_b** (ndarray) Right-hand side (mixed-in) signal.
- energy_scaling_factor_b (float) A scaling factor for features_b energy. It is used to achieve a specific SNR. E.g. to mix with an SNR of 10dB when both features_a and features_b energies are 100, the features_b signal energy needs to be scaled by 0.1. Since different features (e.g. spectrogram, fbank, MFCC) require different combination of transformations (e.g. exp, log, sqrt, pow) to allow mixing of two signals, the exact place where to apply energy_scaling_factor_b to the signal is determined by the implementer.

Return type ndarray

Returns A mixed feature matrix.

static compute energy (features)

Compute the total energy of a feature matrix. How the energy is computed depends on a particular type of features. It is expected that when implemented, compute_energy will never return zero.

Parameters features (ndarray) - A feature matrix.

Return type float

Returns A positive float value of the signal energy.

```
class lhotse.features.mfcc.MfccConfig (dither: float = 0.0, window type: str = 'povey',
                                             frame_length:
                                                             float = 0.025, frame\_shift:
                                             float = 0.01, remove dc offset: bool = True,
                                             round_to_power_of_two: bool = True, energy_floor:
                                             float = 1e-10, min\ duration: float = 0.0, preempha-
                                             sis coefficient: float = 0.97, raw energy: bool =
                                             True, low freq: float = 20.0, high freq: float = 0.0,
                                             num mel bins: int = 23, use energy: bool = False,
                                             vtln low: float = 100.0, vtln high: float = -500.0,
                                             vtln_warp: float = 1.0, cepstral_lifter: float = 22.0,
                                             num\_ceps: int = 13)
    dither: float = 0.0
    window_type: str = 'povey'
    frame_length: float = 0.025
    frame_shift: float = 0.01
    remove_dc_offset: bool = True
    round_to_power_of_two: bool = True
    energy floor: float = 1e-10
    min duration: float = 0.0
    preemphasis_coefficient: float = 0.97
    raw_energy: bool = True
    low freq: float = 20.0
    high_freq: float = 0.0
    num_mel_bins: int = 23
    use_energy: bool = False
    vtln_low: float = 100.0
    vtln_high: float = -500.0
    vtln_warp: float = 1.0
    cepstral lifter: float = 22.0
    num_ceps: int = 13
                           window_type='povey',
     init (dither=0.0,
                                                frame\_length=0.025,
                                                                    frame shift=0.01,
               move_dc_offset=True,
                                        round_to_power_of_two=True,
                                                                        energy_floor=1e-10,
               min_duration=0.0, preemphasis_coefficient=0.97, raw_energy=True, low_freq=20.0,
               high freq=0.0, num mel bins=23, use energy=False, vtln low=100.0, vtln high=- 500.0,
               vtln warp=1.0, cepstral lifter=22.0, num ceps=13)
         Initialize self. See help(type(self)) for accurate signature.
class lhotse.features.mfcc.Mfcc(config=None)
    MFCC feature extractor based on torchaudio.compliance.kaldi.mfcc function.
    name = 'mfcc'
    config_type
         alias of MfccConfig
    feature_dim(sampling_rate)
```

Return type int

```
class lhotse.features.spectrogram.SpectrogramConfig (dither: float = 0.0, window_type:
                                                               str = 'povey', frame length: float
                                                                = 0.025, frame_shift: float =
                                                               0.01, remove_dc_offset: bool =
                                                               True, round to power of two:
                                                               bool = True, energy floor: float
                                                                = 1e-10, min duration: float
                                                                = 0.0, preemphasis_coefficient:
                                                               float = 0.97, raw\_energy: bool =
                                                               True)
     dither: float = 0.0
     window_type: str = 'povey'
     frame length: float = 0.025
     frame shift: float = 0.01
     remove dc offset: bool = True
     round_to_power_of_two: bool = True
     energy floor: float = 1e-10
     min_duration: float = 0.0
     preemphasis_coefficient: float = 0.97
     raw_energy: bool = True
     init (dither=0.0,
                            window type='povey', frame length=0.025,
                                                                      frame shift=0.01,
                move_dc_offset=True,
                                         round_to_power_of_two=True,
                                                                          energy_floor=1e-10,
                min duration=0.0, preemphasis coefficient=0.97, raw energy=True)
         Initialize self. See help(type(self)) for accurate signature.
class lhotse.features.spectrogram.Spectrogram(config=None)
     Log spectrogram feature extractor based on torchaudio.compliance.kaldi.spectrogram function.
     name = 'spectrogram'
     config_type
         alias of SpectrogramConfig
     feature_dim(sampling_rate)
             Return type int
     static mix (features_a, features_b, energy_scaling_factor_b)
         Perform feature-domain mix of two singals, a and b, and return the mixed signal.
             Parameters
                 • features_a (ndarray) – Left-hand side (reference) signal.
                 • features_b (ndarray) – Right-hand side (mixed-in) signal.
```

It is used to achieve a specific SNR. E.g. to mix with an SNR of 10dB when both

features_a and features_b energies are 100, the features_b signal energy needs to be scaled by 0.1. Since different features (e.g. spectrogram, fbank, MFCC) require different combination of transformations (e.g. exp, log, sqrt, pow) to allow mixing

• energy_scaling_factor_b (float) - A scaling factor for features_b energy.

of two signals, the exact place where to apply <code>energy_scaling_factor_b</code> to the signal is determined by the implementer.

Return type ndarray

Returns A mixed feature matrix.

static compute_energy (features)

Compute the total energy of a feature matrix. How the energy is computed depends on a particular type of features. It is expected that when implemented, compute energy will never return zero.

Parameters features (ndarray) - A feature matrix.

Return type float

Returns A positive float value of the signal energy.

9.4.3 Feature storage

class lhotse.features.io.FeaturesWriter

FeaturesWriter defines the interface of how to store numpy arrays in a particular storage backend. This backend could either be:

- separate files on a local filesystem;
- a single file with multiple arrays;
- cloud storage;
- etc.

Each class inheriting from FeaturesWriter must define:

- the write() method, which defines the storing operation (accepts a key used to place the value array in the storage);
- the storage_path () property, which is either a common directory for the files, the name of the file storing multiple arrays, name of the cloud bucket, etc.
- the name () property that is unique to this particular storage mechanism it is stored in the features manifests (metadata) and used to automatically deduce the backend when loading the features.

Each FeaturesWriter can also be used as a context manager, as some implementations might need to free a resource after the writing is finalized. By default nothing happens in the context manager functions, and this can be modified by the inheriting subclasses.

Example:

with MyWriter('some/path') as storage: extractor.extract_from_recording_and_store(recording, storage)

The features loading must be defined separately in a class inheriting from FeaturesReader.

```
abstract property name
```

Return type str

abstract property storage_path

Return type str

abstract write(key, value)

Return type str

class lhotse.features.io.FeaturesReader

FeaturesReader defines the interface of how to load numpy arrays from a particular storage backend. This backend could either be:

- · separate files on a local filesystem;
- a single file with multiple arrays;
- · cloud storage;
- etc.

Each class inheriting from FeaturesReader must define:

- the read() method, which defines the loading operation (accepts the key to locate the array in the storage and return it). The read method should support selecting only a subset of the feature matrix, with the bounds expressed as arguments left_offset_frames and right_offset_frames. It's up to the Reader implementation to load only the required part or trim it to that range only after loading. It is assumed that the time dimension is always the first one.
- the name () property that is unique to this particular storage mechanism it is stored in the features manifests (metadata) and used to automatically deduce the backend when loading the features.

The features writing must be defined separately in a class inheriting from FeaturesWriter.

```
abstract property name
             Return type str
     abstract read(key, left offset frames=0, right offset frames=None)
             Return type ndarray
lhotse.features.io.available_storage_backends()
          Return type List[str]
lhotse.features.io.register_reader(cls)
     Decorator used to add a new FeaturesReader to Lhotse's registry.
     Example:
          @register_reader class MyFeatureReader(FeatureReader):
lhotse.features.io.register_writer(cls)
     Decorator used to add a new FeaturesWriter to Lhotse's registry.
     Example:
          @register_writer class MyFeatureWriter(FeatureWriter):
lhotse.features.io.get_reader(name)
     Find a FeaturesReader sub-class that corresponds to the provided name and return its type.
     Example:
          reader_type = get_reader("lilcom_files") reader = reader_type("/storage/features/")
          Return type Type[FeaturesReader]
```

```
lhotse.features.io.get writer(name)
     Find a FeaturesWriter sub-class that corresponds to the provided name and return its type.
     Example:
          writer_type = get_writer("lilcom_files") writer = writer_type("/storage/features/")
          Return type Type[FeaturesWriter]
class lhotse.features.io.LilcomFilesReader(storage_path, *args, **kwargs)
     Reads Lilcom-compressed files from a directory on the local filesystem. storage_path corresponds to the
     directory path; storage_key for each utterance is the name of the file in that directory.
     name = 'lilcom files'
     __init__ (storage_path, *args, **kwargs)
          Initialize self. See help(type(self)) for accurate signature.
     read (key, left_offset_frames=0, right_offset_frames=None)
              Return type ndarray
class lhotse.features.io.LilcomFilesWriter(storage_path,
                                                                                              *args,
                                                                         tick power=-
     Writes Lilcom-compressed files to a directory on the local filesystem. storage_path corresponds to the
     directory path; storage_key for each utterance is the name of the file in that directory.
     name = 'lilcom files'
      __init__ (storage_path, tick_power=- 5, *args, **kwargs)
          Initialize self. See help(type(self)) for accurate signature.
     property storage_path
              Return type str
     write (key, value)
              Return type str
class lhotse.features.io.NumpyFilesReader(storage_path, *args, **kwargs)
     Reads non-compressed numpy arrays from files in a directory on the local filesystem. storage_path corre-
     sponds to the directory path; storage_key for each utterance is the name of the file in that directory.
     name = 'numpy files'
     __init__ (storage_path, *args, **kwargs)
          Initialize self. See help(type(self)) for accurate signature.
     read (key, left_offset_frames=0, right_offset_frames=None)
              Return type ndarray
class lhotse.features.io.NumpyFilesWriter(storage path, *args, **kwargs)
     Writes non-compressed numpy arrays to files in a directory on the local filesystem. storage_path corre-
     sponds to the directory path; storage_key for each utterance is the name of the file in that directory.
     name = 'numpy_files'
     ___init___(storage_path, *args, **kwargs)
          Initialize self. See help(type(self)) for accurate signature.
     property storage_path
              Return type str
```

```
write (key, value)
```

```
Return type str
```

```
lhotse.features.io.lookup_cache_or_open(storage_path)
```

Helper internal function used in HDF5 readers. It opens the HDF files and keeps their handles open in a global program cache to avoid excessive amount of syscalls when the *Reader class is instantiated and destroyed in a loop repeatedly (frequent use-case).

The file handles can be freed at any time by calling close cached file handles ().

```
lhotse.features.io.close_cached_file_handles()
```

Closes the cached file handles in lookup_cache_or_open (see its docs for more details).

```
Return type None
```

```
class lhotse.features.io.NumpyHdf5Reader(storage_path, *args, **kwargs)
```

Reads non-compressed numpy arrays from a HDF5 file with a "flat" layout. Each array is stored as a separate HDF Dataset because their shapes (numbers of frames) may vary. storage_path corresponds to the HDF5 file path; storage_key for each utterance is the key corresponding to the array (i.e. HDF5 "Group" name).

```
name = 'numpy_hdf5'
__init__(storage_path, *args, **kwargs)
```

Initialize self. See help(type(self)) for accurate signature.

read (key, left offset frames=0, right offset frames=None)

Return type ndarray

```
class lhotse.features.io.NumpyHdf5Writer(storage_path, *args, **kwargs)
```

Writes non-compressed numpy arrays to a HDF5 file with a "flat" layout. Each array is stored as a separate HDF Dataset because their shapes (numbers of frames) may vary. storage_path corresponds to the HDF5 file path; storage_key for each utterance is the key corresponding to the array (i.e. HDF5 "Group" name).

```
name = 'numpy_hdf5'
```

```
__init__ (storage_path, *args, **kwargs)
```

Initialize self. See help(type(self)) for accurate signature.

property storage_path

Return type str

write(key, value)

Return type str

close()

Return type None

```
class lhotse.features.io.LilcomHdf5Reader(storage_path, *args, **kwargs)
```

Reads lilcom-compressed numpy arrays from a HDF5 file with a "flat" layout. Each array is stored as a separate HDF Dataset because their shapes (numbers of frames) may vary. storage_path corresponds to the HDF5 file path; storage_key for each utterance is the key corresponding to the array (i.e. HDF5 "Group" name).

```
name = 'lilcom_hdf5'
```

```
__init__ (storage_path, *args, **kwargs)
```

Initialize self. See help(type(self)) for accurate signature.

read (key, left_offset_frames=0, right_offset_frames=None)

Return type ndarray

Writes lilcom-compressed numpy arrays to a HDF5 file with a "flat" layout. Each array is stored as a separate HDF Dataset because their shapes (numbers of frames) may vary. storage_path corresponds to the HDF5 file path; storage_key for each utterance is the key corresponding to the array (i.e. HDF5 "Group" name).

9.4.4 Feature-domain mixing

Utility class to mix multiple feature matrices into a single one. It should be instantiated separately for each mixing session (i.e. each MixedCut will create a separate FeatureMixer to mix its tracks). It is initialized with a numpy array of features (typically float32) that represents the "reference" signal for the mix. Other signals can be mixed to it with different time offsets and SNRs using the add_to_mix method. The time offset is relative to the start of the reference signal (only positive values are supported). The SNR is relative to the energy of the signal used to initialize the FeatureMixer.

It relies on the FeatureExtractor to have defined mix and compute_energy methods, so that the FeatureMixer knows how to scale and add two feature matrices together.

```
__init__ (feature_extractor, base_feats, frame_shift, padding_value=- 1000.0)
```

Parameters

- **feature_extractor** (FeatureExtractor) The FeatureExtractor instance that specifies how to mix the features.
- base_feats (ndarray) The features used to initialize the FeatureMixer are a point of reference in terms of energy and offset for all features mixed into them.
- **frame_shift** (float) Required to correctly compute offset and padding during the mix.
- padding_value (float) The value used to pad the shorter features during the mix. This value is adequate only for log space features. For non-log space features, e.g. energies, use either 0 or a small positive value like 1e-5.

property num_features

property unmixed_feats

Return a numpy ndarray with the shape (num_tracks, num_frames, num_features), where each track's feature matrix is padded and scaled adequately to the offsets and SNR used in add_to_mix call.

Return type ndarray

property mixed_feats

Return a numpy ndarray with the shape (num_frames, num_features) - a mono mixed feature matrix of the tracks supplied with add_to_mix calls.

Return type ndarray

add_to_mix (feats, snr=None, offset=0.0)

Add feature matrix of a new track into the mix. :type feats: ndarray :param feats: A 2D feature matrix to be mixed in. :type snr: Optional[float] :param snr: Signal-to-noise ratio, assuming feats represents noise (positive SNR - lower feats energy, negative SNR - higher feats energy) :type offset: float :param offset: How many seconds to shift feats in time. For mixing, the signal will be padded before the start with low energy values.

9.5 Augmentation

9.6 Cuts

Data structures and tools used to create training/testing examples.

class lhotse.cut.CutUtilsMixin

A mixin class for cuts which contains all the methods that share common implementations.

Note: Ideally, this would've been an abstract base class specifying the common interface, but ABC's do not mix well with dataclasses in Python. It is possible we'll ditch the dataclass for cuts in the future and make this an ABC instead.

property trimmed_supervisions

Return the supervisions in this Cut that have modified time boundaries so as not to exceed the Cut's start or end.

Note that when cut.supervisions is called, the supervisions may have negative start values that indicate the supervision actually begins before the cut, or end values that exceed the Cut's duration (it means the supervision continued in the original recording after the Cut's ending).

Return type List[SupervisionSegment]

mix (other, offset_other_by=0.0, snr=None)

Refer to mix() documentation.

Return type MixedCut

append (other, snr=None)

Append the other Cut after the current Cut. Conceptually the same as mix but with an offset matching the current cuts length. Optionally scale down (positive SNR) or scale up (negative SNR) the other cut. Returns a MixedCut, which only keeps the information about the mix; actual mixing is performed during the call to load_features.

Return type MixedCut

compute_features (extractor, augment_fn=None)

Compute the features from this cut. This cut has to be able to load audio.

Parameters

• **extractor** (FeatureExtractor) – a FeatureExtractor instance used to compute the features.

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• augment_fn (Optional[Callable[[ndarray, int], ndarray]]) - optional WavAugmenter instance for audio augmentation.

Return type ndarray

Returns a numpy ndarray with the computed features.

plot_audio()

Display a plot of the waveform. Requires matplotlib to be installed.

play_audio()

Display a Jupyter widget that allows to listen to the waveform. Works only in Jupyter notebook/lab or similar (e.g. Colab).

plot_features()

Display the feature matrix as an image. Requires matplotlib to be installed.

speakers_feature_mask (min_speaker_dim=None, speaker_to_idx_map=None)

Return a matrix of per-speaker activity in a cut. The matrix shape is (num_speakers, num_frames), and its values are 0 for nonspeech **frames** and 1 for speech **frames** for each respective speaker.

This is somewhat inspired by the TS-VAD setup: https://arxiv.org/abs/2005.07272

Parameters

- min_speaker_dim (Optional[int]) optional int, when specified it will enforce that the matrix shape is at least that value (useful for datasets like CHiME 6 where the number of speakers is always 4, but some cuts might have less speakers than that).
- **speaker_to_idx_map** (Optional[Dict[str, int]]) optional dict mapping speaker names (strings) to their global indices (ints). Useful when you want to preserve the order of the speakers (e.g. speaker XYZ is always mapped to index 2)

Return type ndarray

speakers_audio_mask (min_speaker_dim=None, speaker_to_idx_map=None)

Return a matrix of per-speaker activity in a cut. The matrix shape is (num_speakers, num_samples), and its values are 0 for nonspeech **samples** and 1 for speech **samples** for each respective speaker.

This is somewhat inspired by the TS-VAD setup: https://arxiv.org/abs/2005.07272

Parameters

- min_speaker_dim (Optional[int]) optional int, when specified it will enforce that the matrix shape is at least that value (useful for datasets like CHiME 6 where the number of speakers is always 4, but some cuts might have less speakers than that).
- **speaker_to_idx_map** (Optional[Dict[str, int]]) optional dict mapping speaker names (strings) to their global indices (ints). Useful when you want to preserve the order of the speakers (e.g. speaker XYZ is always mapped to index 2)

Return type ndarray

supervisions_feature_mask()

Return a 1D numpy array with value 1 for **frames** covered by at least one supervision, and 0 for **frames** not covered by any supervision.

Return type ndarray

supervisions_audio_mask()

Return a 1D numpy array with value 1 for **samples** covered by at least one supervision, and 0 for **samples** not covered by any supervision.

Return type ndarray

```
with id(id)
```

Return a copy of the Cut with a new ID.

```
Return type Union[Cut, MixedCut, PaddingCut]
```

```
class lhotse.cut.Cut (id: str, start: float, duration: float, channel: int, supervisions:

List[lhotse.supervision.SupervisionSegment] = <factory>, features:

Optional[lhotse.features.base.Features] = None, recording: Optional[lhotse.audio.Recording] = None)
```

A Cut is a single "segment" that we'll train on. It contains the features corresponding to a piece of a recording, with zero or more SupervisionSegments.

The SupervisionSegments indicate which time spans of the Cut contain some kind of supervision information: e.g. transcript, speaker, language, etc. The regions without a corresponding SupervisionSegment may contain anything - usually we assume it's either silence or some kind of noise.

Note: The SupervisionSegment time boundaries are relative to the beginning of the cut. E.g. if the underlying Recording starts at 0s (always true), the Cut starts at 100s, and the SupervisionSegment starts at 3s, it means that in the Recording the supervision actually started at 103s. In some cases, the supervision might have a negative start, or a duration exceeding the duration of the Cut; this means that the supervision in the recording extends beyond the Cut.

```
id: str
        Seconds
start:
duration:
           Seconds
channel: int
supervisions:
               List[SupervisionSegment]
features:
           Optional[Ihotse.features.base.Features] = None
recording: Optional[lhotse.audio.Recording] = None
property recording_id
       Return type str
property end
       Return type float
property has_features
       Return type bool
property has_recording
       Return type bool
property frame_shift
       Return type Optional[float]
property num_frames
       Return type Optional[int]
property num_samples
       Return type Optional[int]
property num_features
       Return type Optional[int]
```

property features_type

Return type Optional[str]

property sampling_rate

Return type int

load features()

Load the features from the underlying storage and cut them to the relevant [begin, duration] region of the current Cut.

Return type Optional[ndarray]

load_audio()

Load the audio by locating the appropriate recording in the supplied RecordingSet. The audio is trimmed to the [begin, end] range specified by the Cut.

Return type Optional[ndarray]

Returns a numpy ndarray with audio samples, with shape (1 <channel>, N <samples>)

compute_and_store_features (extractor, storage, augment_fn=None, *args, **kwargs)

Compute the features from this cut, store them on disk, and attach a feature manifest to this cut. This cut has to be able to load audio.

Parameters

- **extractor** (FeatureExtractor) a FeatureExtractor instance used to compute the features.
- **output** dir the directory where the computed features will be stored.
- augment_fn (Optional[Callable[[ndarray, int], ndarray]]) an optional callable used for audio augmentation.

Return type Union[Cut, MixedCut, PaddingCut]

Returns a new Cut instance with a Features manifest attached to it.

truncate (*, offset=0.0, duration=None, keep_excessive_supervisions=True, preserve_id=False) Returns a new Cut that is a sub-region of the current Cut.

Note that no operation is done on the actual features - it's only during the call to load_features() when the actual changes happen (a subset of features is loaded).

Parameters

- **offset** (float) float (seconds), controls the start of the new cut relative to the current Cut's start. E.g., if the current Cut starts at 10.0, and offset is 2.0, the new start is 12.0.
- **duration** (Optional[float]) optional float (seconds), controls the duration of the resulting Cut. By default, the duration is (end of the cut before truncation) (offset).
- **keep_excessive_supervisions** (bool) bool. Since trimming may happen inside a SupervisionSegment, the caller has an option to either keep or discard such supervisions.
- preserve_id (bool) bool. Should the truncated cut keep the same ID or get a new, random one.

Return type Cut

Returns a new Cut instance. If the current Cut is shorter than the duration, return None.

```
pad (duration)
          Return a new MixedCut, padded to duration seconds with zeros in the recording, and low-energy values
          in each feature bin.
             Parameters duration (float) – The cut's minimal duration after padding.
             Return type Union[Cut, MixedCut, PaddingCut]
             Returns a padded MixedCut if duration is greater than this cut's duration, otherwise self.
     map supervisions(transform fn)
          Modify the SupervisionSegments by transform_fn of this Cut.
             Parameters transform_fn
                                                           (Callable[[SupervisionSegment],
                 SupervisionSegment]) – a function that modifies a supervision as an argument.
             Return type Union[Cut, MixedCut, PaddingCut]
             Returns a modified Cut.
     static from_dict(data)
             Return type Cut
     with_features_path_prefix (path)
             Return type Cut
     with_recording_path_prefix(path)
             Return type Cut
     __init__ (id, start, duration, channel, supervisions=<factory>, features=None, recording=None)
          Initialize self. See help(type(self)) for accurate signature.
class lhotse.cut.PaddingCut (id: str, duration: float, sampling_rate: int, use_log_energy: bool,
                                   num frames: Optional[int] = None, num features: Optional[int] =
                                   None, num samples: Optional[int] = None)
     This represents a cut filled with zeroes in the time domain, or low energy/log-energy values in the frequency
     domain. It's used to make training samples evenly sized (same duration/number of frames).
     id: str
     duration: Seconds
     sampling_rate:
     use log energy: bool
     num_frames: Optional[int] = None
     num_features: Optional[int] = None
     num samples: Optional[int] = None
     property start
             Return type float
     property end
             Return type float
     property supervisions
     property has_features
             Return type bool
```

```
property has_recording
              Return type bool
     property frame_shift
     load_features (*args, **kwargs)
              Return type Optional[ndarray]
     load audio (*args, **kwargs)
              Return type Optional[ndarray]
     truncate (*, offset=0.0, duration=None, keep_excessive_supervisions=True, preserve_id=False)
              Return type PaddingCut
     pad (duration)
          Create a new PaddingCut with duration when its longer than this Cuts duration. Helper function used
          in batch cut padding.
              Parameters duration (float) – The cuts minimal duration after padding.
              Return type PaddingCut
              Returns self or a new PaddingCut, depending on duration.
     compute_and_store_features (extractor, *args, **kwargs)
          Returns a new PaddingCut with updates information about the feature dimension and number of feature
          frames, depending on the extractor properties.
              Return type Union[Cut, MixedCut, PaddingCut]
     map_supervisions(transform_fn)
          Just for consistency with Cut and MixedCut.
              Parameters transform_fn (Callable[[Any], Any]) - a dummy function that would be
                  never called actually.
              Return type Union[Cut, MixedCut, PaddingCut]
              Returns the PaddingCut itself.
     static from dict(data)
              Return type PaddingCut
     with_features_path_prefix (path)
              Return type PaddingCut
     with_recording_path_prefix(path)
              Return type PaddingCut
      __init__(id, duration, sampling_rate, use_log_energy, num_frames=None, num_features=None,
                 num_samples=None)
          Initialize self. See help(type(self)) for accurate signature.
class lhotse.cut.MixTrack(cut: Union[lhotse.cut.Cut, lhotse.cut.PaddingCut], offset: float = 0.0,
                                 snr: Optional[float] = None
     Represents a single track in a mix of Cuts. Points to a specific Cut and holds information on how to mix it with
     other Cuts, relative to the first track in a mix.
     cut: Union[Cut, PaddingCut]
     offset: float = 0.0
```

```
snr: Optional[float] = None
     static from_dict(data)
     ___init___(cut, offset=0.0, snr=None)
          Initialize self. See help(type(self)) for accurate signature.
class lhotse.cut.MixedCut (id: str, tracks: List[lhotse.cut.MixTrack])
     Represents a Cut that's created from other Cuts via mix or append operations. The actual mixing operations are
     performed upon loading the features into memory. In order to load the features, it needs to access the CutSet
     object that holds the "ingredient" cuts, as it only holds their IDs ("pointers"). The SNR and offset of all the
     tracks are specified relative to the first track.
     id:
           str
     tracks: List[MixTrack]
     property supervisions
          Lists the supervisions of the underlying source cuts. Each segment start time will be adjusted by the track
             Return type List[SupervisionSegment]
     property start
             Return type float
     property end
             Return type float
     property duration
             Return type float
     property has_features
             Return type bool
     property has_recording
             Return type bool
     property num_frames
             Return type Optional[int]
     property frame_shift
             Return type Optional[float]
     property sampling_rate
             Return type Optional[int]
     property num_samples
             Return type Optional[int]
     property num_features
             Return type Optional[int]
     property features_type
             Return type Optional[str]
```

truncate (*, offset=0.0, duration=None, keep_excessive_supervisions=True, preserve_id=False)

Returns a new MixedCut that is a sub-region of the current MixedCut. This method truncates the underlying Cuts and modifies their offsets in the mix, as needed. Tracks that do not fit in the truncated cut are removed.

Note that no operation is done on the actual features - it's only during the call to load_features() when the actual changes happen (a subset of features is loaded).

Parameters

- offset (float) float (seconds), controls the start of the new cut relative to the current MixedCut's start.
- **duration** (Optional[float]) optional float (seconds), controls the duration of the resulting MixedCut. By default, the duration is (end of the cut before truncation) (offset).
- **keep_excessive_supervisions** (bool) bool. Since trimming may happen inside a SupervisionSegment, the caller has an option to either keep or discard such supervisions.
- preserve_id (bool) bool. Should the truncated cut keep the same ID or get a new, random one.

Return type MixedCut

Returns a new MixedCut instance.

pad (duration)

Return a new MixedCut, padded to duration seconds with zeros in the recording, and low-energy values in each feature bin.

Parameters duration (float) - The cut's minimal duration after padding.

Return type Union[Cut, MixedCut, PaddingCut]

Returns a padded MixedCut if duration is greater than this cut's duration, otherwise self.

load features (mixed=True)

Loads the features of the source cuts and mixes them on-the-fly.

Parameters mixed (bool) – when True (default), returns a 2D array of features mixed in the feature domain. Otherwise returns a 3D array with the first dimension equal to the number of tracks.

Return type Optional[ndarray]

Returns A numpy ndarray with features and with shape (num_frames, num_features), or (num_tracks, num_frames, num_features)

load audio (mixed=True)

Loads the audios of the source cuts and mix them on-the-fly.

Parameters mixed (bool) – When True (default), returns a mono mix of the underlying tracks. Otherwise returns a numpy array with the number of channels equal to the number of tracks.

Return type Optional[ndarray]

Returns A numpy ndarray with audio samples and with shape (num_channels, num_samples)

plot_tracks_features()

Display the feature matrix as an image. Requires matplotlib to be installed.

plot_tracks_audio()

Display plots of the individual tracks' waveforms. Requires matplotlib to be installed.

compute_and_store_features (extractor, storage, augment_fn=None, mix_eagerly=True)

Compute the features from this cut, store them on disk, and create a new *Cut* object with the feature manifest attached. This cut has to be able to load audio.

Parameters

- **extractor** (FeatureExtractor) a FeatureExtractor instance used to compute the features.
- **storage** (FeaturesWriter) a FeaturesWriter instance used to store the features
- augment_fn (Optional[Callable[[ndarray, int], ndarray]]) an optional callable used for audio augmentation.
- mix_eagerly (bool) when False, extract and store the features for each track separately, and mix them dynamically when loading the features. When True, mix the audio first and store the mixed features, returning a new Cut instance with the same ID. The returned Cut will not have a Recording attached.

```
Return type Union[Cut, MixedCut, PaddingCut]
```

Returns a new Cut instance if mix_eagerly is True, or returns self with each of the tracks containing the Features manifests.

```
map_supervisions (transform_fn)
```

Modify the SupervisionSegments by transform_fn of this MixedCut.

```
\begin{tabular}{ll} \textbf{Parameters transform\_fn} & (\texttt{Callable}[[SupervisionSegment], \\ SupervisionSegment]) - a function that modifies a supervision as an argument. \\ \end{tabular}
```

Return type Union[Cut, MixedCut, PaddingCut]

Returns a modified MixedCut.

```
static from_dict(data)
```

Return type MixedCut

with_features_path_prefix(path)

Return type MixedCut

with_recording_path_prefix (path)

Return type MixedCut

init (id, tracks)

Initialize self. See help(type(self)) for accurate signature.

```
class lhotse.cut.CutSet(*args, **kwds)
```

CutSet combines features with their corresponding supervisions. It may have wider span than the actual supervisions, provided the features for the whole span exist. It is the basic building block of PyTorch-style Datasets for speech/audio processing tasks.

```
Return type Iterable[str]
property speakers
         Return type FrozenSet[str]
static from_cuts(cuts)
         Return type CutSet
static from manifests (recordings=None, supervisions=None, features=None)
     Create a CutSet from any combination of supervision, feature and recording manifests. At least one
     of recording_set or feature_set is required. The Cut boundaries correspond to those found
     in the feature_set, when available, otherwise to those found in the recording_set When a
     supervision_set is provided, we'll attach to the Cut all supervisions that have a matching recording
     ID and are fully contained in the Cut's boundaries.
         Return type CutSet
static from_dicts(data)
         Return type CutSet
to dicts()
         Return type List[dict]
describe()
     Print a message describing details about the CutSet - the number of cuts and the duration statistics,
     including the total duration and the percentage of speech segments.
     Example output: Cuts count: 547 Total duration (hours): 326.4 Speech duration (hours): 79.6 (24.4%)
         *** Duration statistics (seconds): mean 2148.0 std 870.9 min 477.0 25% 1523.0 50% 2157.0 75%
         2423.0 max 5415.0 dtype: float64
         Return type None
split (num_splits, randomize=False)
     Split the CutSet into num_splits pieces of equal size.
         Parameters
             • num_splits (int) - Requested number of splits.
             • randomize (bool) – Optionally randomize the cuts order first.
         Return type List[CutSet]
         Returns A list of Cut Set pieces.
filter (predicate)
     Return a new CutSet with the Cuts that satisfy the predicate.
         Parameters predicate (Callable[[Union[Cut, MixedCut, PaddingCut]], bool])
            – a function that takes a cut as an argument and returns bool.
         Return type CutSet
         Returns a filtered CutSet.
trim_to_supervisions()
     Return a new CutSet with Cuts that have identical spans as their supervisions.
         Return type CutSet
         Returns a CutSet.
```

trim to unsupervised segments()

Return a new CutSet with Cuts created from segments that have no supervisions (likely silence or noise).

```
Return type CutSet
```

Returns a CutSet.

mix_same_recording_channels()

Find cuts that come from the same recording and have matching start and end times, but represent different channels. Then, mix them together (in matching groups) and return a new CutSet that contains their mixes. This is useful for processing microphone array recordings.

It is intended to be used as the first operation after creating a new CutSet (but might also work in other circumstances, e.g. if it was cut to windows first).

Example:

```
>>> ami = prepare_ami('path/to/ami')
>>> cut_set = CutSet.from_manifests(recordings=ami['train']['recordings'])
>>> multi_channel_cut_set = cut_set.mix_same_recording_channels()
```

In the AMI example, the multi_channel_cut_set will yield MixedCuts that hold all single-channel Cuts together.

```
Return type CutSet
```

sort by duration(ascending=False)

Sort the CutSet according to cuts duration. Descending by default.

```
Return type CutSet
```

pad (duration=None)

Return a new CutSet with Cuts padded to duration in seconds. Cuts longer than duration will not be affected. Cuts will be padded to the right (i.e. after the signal). :type duration: Optional[float] :param duration: The cuts minimal duration after padding. When not specified, we'll choose the duration of the longest cut in the CutSet. :rtype: CutSet :return: A padded CutSet.

truncate (max_duration, offset_type, keep_excessive_supervisions=True, preserve_id=False)

Return a new CutSet with the Cuts truncated so that their durations are at most <code>max_duration</code>. Cuts shorter than <code>max_duration</code> will not be changed. :type <code>max_duration</code>: <code>float</code> :param <code>max_duration</code>: float, the maximum duration in seconds of a cut in the resulting manifest. :type offset_type: <code>str</code> :param offset_type: str, can be: - 'start' => cuts are truncated from their start; - 'end' => cuts are truncated from their end minus <code>max_duration</code>; - 'random' => cuts are truncated randomly between their start and their end minus <code>max_duration</code> :type <code>keep_excessive_supervisions</code>: <code>bool</code> :param <code>keep_excessive_supervisions</code>: <code>bool</code> :param <code>keep_excessive_supervisions</code>: <code>bool</code> :type <code>preserve_id</code>: <code>bool</code> :param <code>preserve_id</code>: <code>bool</code> :param <code>preserve_id</code>: <code>bool</code> :param <code>preserve_id</code>: <code>bool</code> . Should the truncated cut <code>keep</code> the same ID or get a new, random one. :rtype: <code>CutSet</code> :return: a new CutSet instance with truncated cuts.

cut_into_windows (duration, keep_excessive_supervisions=True)

Return a new CutSet, made by traversing each Cut in windows of duration seconds and creating new Cut out of them.

The last window might have a shorter duration if there was not enough audio, so you might want to use either .filter() or .pad() afterwards to obtain a uniform duration CutSet.

Parameters

- duration (float) Desired duration of the new cuts in seconds.
- **keep_excessive_supervisions** (bool) bool. When a cut is truncated in the middle of a supervision segment, should the supervision be kept.

```
Return type CutSet
```

Returns a new CutSet with cuts made from shorter duration windows.

Modify the current Cut Set with by extracting features and attaching the feature manifests to the cuts.

Parameters

- **extractor** (FeatureExtractor) A FeatureExtractor instance (either Lhotse's built-in or a custom implementation).
- **storage** (FeaturesWriter) A FeaturesWriter instance used to store the features.
- augment_fn (Optional[Callable[[ndarray, int], ndarray]]) an optional callable used for audio augmentation.
- **executor** (Optional[Any]) when provided, will be used to parallelize the feature extraction process. Any executor satisfying the standard concurrent.futures interface will be suitable; e.g. ProcessPoolExecutor, ThreadPoolExecutor, or dask.Client for distributed task execution (see: https://docs.dask.org/en/latest/futures.html?highlight=Client#start-dask-client)
- mix_eagerly (bool) Related to how the features are extracted for MixedCut instances, if any are present. When False, extract and store the features for each track separately, and mix them dynamically when loading the features. When True, mix the audio first and store the mixed features, returning a new Cut instance with the same ID. The returned Cut will not have a Recording attached.

```
Return type CutSet
```

Returns a new CutSet instance with the same Cut``s, but with attached ``Features objects

```
with_features_path_prefix (path)
```

Return type CutSet

with_recording_path_prefix(path)

Return type CutSet

map_supervisions (transform_fn)

Modify the SupervisionSegments by *transform_fn* in this CutSet.

```
Parameters transform fn
```

(Callable[[SupervisionSegment],

SupervisionSegment]) – a function that modifies a supervision as an argument.

Return type CutSet

Returns a new, modified CutSet.

```
transform_text (transform_fn)
```

Return a copy of this CutSet with all SupervisionSegments text transformed with transform_fn. Useful for text normalization, phonetic transcription, etc.

Parameters transform_fn (Callable[[str], str]) – a function that accepts a string and returns a string.

Return type CutSet

Returns a new, modified CutSet.

```
init (cuts)
```

Initialize self. See help(type(self)) for accurate signature.

Converts a FeatureSet to a CutSet by traversing each Features object in - possibly overlapping - windows, and creating a Cut out of that area. By default, the last window in traversal will be discarded if it cannot satisfy the *cut_duration* requirement.

Parameters

- feature set (FeatureSet) a FeatureSet object.
- cut_duration (float) float, duration of created Cuts in seconds.
- **cut_shift** (Optional[float]) optional float, specifies how many seconds are in between the starts of consecutive windows. Equals *cut_duration* by default.
- **keep_shorter_windows** (bool) bool, when True, the last window will be used to create a Cut even if its duration is shorter than *cut_duration*.

Return type CutSet

Returns a CutSet object.

lhotse.cut.mix(reference_cut, mixed_in_cut, offset=0, snr=None)

Overlay, or mix, two cuts. Optionally the *mixed_in_cut* may be shifted by *offset* seconds and scaled down (positive SNR) or scaled up (negative SNR). Returns a MixedCut, which contains both cuts and the mix information. The actual feature mixing is performed during the call to MixedCut.load_features().

Parameters

- reference_cut (Union[Cut, MixedCut, PaddingCut]) The reference cut for the mix offset and snr are specified w.r.t this cut.
- mixed_in_cut (Union[Cut, MixedCut, PaddingCut]) The mixed-in cut it will be offset and rescaled to match the offset and snr parameters.
- offset (float) How many seconds to shift the mixed_in_cut w.r.t. the reference_cut.
- **snr** (Optional[float]) Desired SNR of the *right_cut* w.r.t. the *left_cut* in the mix.

Return type MixedCut

Returns A MixedCut instance.

lhotse.cut.append(left_cut, right_cut, snr=None)

Helper method for functional-style appending of Cuts.

Return type MixedCut

lhotse.cut.mix cuts(cuts)

Return a MixedCut that consists of the input Cuts mixed with each other as-is.

Return type MixedCut

lhotse.cut.append_cuts(cuts)

Return a MixedCut that consists of the input Cuts appended to each other as-is.

Return type Union[Cut, MixedCut, PaddingCut]

9.7 Recipes

Convenience methods used to prepare recording and supervision manifests for standard corpora.

9.8 Kaldi conversion

Convenience methods used to interact with Kaldi data directories.

```
lhotse.kaldi.load_kaldi_data_dir(path, sampling_rate)
```

Load a Kaldi data directory and convert it to a Lhotse RecordingSet and SupervisionSet manifests. For this to work, at least the wav.scp file must exist. SupervisionSet is created only when a segments file exists. All the other files (text, utt2spk, etc.) are optional, and some of them might not be handled yet. In particular, feats.scp files are ignored.

Return type Tuple[RecordingSet, Optional[SupervisionSet]]

lhotse.kaldi.load_kaldi_text_mapping(path, must_exist=False)

Load Kaldi files such as utt2spk, spk2gender, text, etc. as a dict.

Return type Dict[str, Optional[str]]

9.9 Others

Helper methods used throughout the codebase.

lhotse.manipulation.combine(*manifests)

Combine multiple manifests of the same type into one.

Return type ~Manifest

lhotse.manipulation.to_manifest(items)

Take an iterable of data types in Lhotse such as Recording, SupervisonSegment or Cut, and create the manifest of the corresponding type. When the iterable is empty, returns None.

Return type Optional[~Manifest]

lhotse.manipulation.load_manifest(path)

Generic utility for reading an arbitrary manifest.

Return type ~Manifest

CHAPTER

TEN

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