# pobm Documentation

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**CHAPTER** 

ONE

### **POBM PACKAGE**

# 1.1 Subpackages

### 1.1.1 pobm.obm package

#### 1.1.1.1 Submodules

#### 1.1.1.2 pobm.obm.burden

Bases: object

Class that calculates Hypoxic Burden Features from spo2 time series. Suppose that the data has been preprocessed.

#### **Parameters**

- **begin** List of indices of beginning of each desaturation event.
- end List of indices of end of each desaturation event.
- CT\_Threshold Percentage of the time spent below the "CT\_Threshold" % oxygen saturation level.
- CA\_Baseline Baseline to compute the CA feature. Default value is mean of the signal.

compute (signal)

Parameters signal – 1-d array, of shape (N,) where N is the length of the signal

#### Returns

#### HypoxicBurdenMeasuresResults class containing the following features:

- CA: Integral SpO2 below the xx SpO2 level normalized by the total recording time
- CT: Percentage of the time spent below the xx% oxygen saturation level
- POD: Percentage of oxygen desaturation events
- AODmax: The area under the oxygen desaturation event curve, using the maximum SpO2 value as baseline and normalized by the total recording time
- AOD100: Cumulative area of desaturations under the 100% SpO2 level as baseline and normalized by the total recording time

Example:

```
from pobm.obm.burden import HypoxicBurdenMeasures

# Initialize the class with the desired parameters
hypoxic_class = HypoxicBurdenMeasures(results_desat.begin, results_desat.end,__

CT_Threshold=90, CA_Baseline=90)

# Compute the biomarkers
results_hypoxic = hypoxic_class.compute(spo2_signal)
```

#### 1.1.1.3 pobm.obm.complex

```
class pobm.obm.complex.ComplexityMeasures (CTM\_Threshold=0.25, DFA\_Window=20, M\_Sampen=3, R\_Sampen=0.2, M\_ApEn=2, R\_ApEn=0.25)
```

Bases: object

Class that calculates Complexity Features from spo2 time series. Suppose that the data has been preprocessed.

**:param** signal: 1-d array, of shape (N,) where N is the length of the signal CTM\_Threshold: Radius of Central Tendency Measure. DFA\_Window: Length of window to calculate DFA biomarker. M\_Sampen: Embedding dimension to compute SampEn. R\_Sampen: Tolerance to compute SampEn. M\_ApEn: Embedding dimension to compute ApEn. R\_ApEn: Tolerance to compute ApEn.

 $compute(signal) \rightarrow pobm.\_ResultsClasses.ComplexityMeasuresResults$ 

**Parameters** signal – 1-d array, of shape (N,) where N is the length of the signal

#### Returns

#### ComplexityMeasuresResults class containing the following features:

- ApEn: Approximate Entropy.
- LZ: Lempel-Ziv complexity.
- CTM: Central Tendency Measure.
- SampEn: Sample Entropy.
- DFA: Detrended Fluctuation Analysis.

#### Example:

#### 1.1.1.4 pobm.obm.desat

```
class pobm.obm.desat.DesaturationsMeasures (ODI_Threshold=3)
    Bases: object
```

Class that calculates the Desaturation Features from spo2 time series. Suppose that the data has been preprocessed.

**Parameters ODI\_Threshold** – Threshold to compute Oxygen Desaturation Index.

```
compute(signal) \rightarrow pobm.\_ResultsClasses.DesaturationsMeasuresResults
```

Parameters signal - 1-d array, of shape (N,) where N is the length of the signal

#### Returns

#### DesaturationsMeasuresResults class containing the following features:

- DL\_u: Mean of desaturation length
- DL\_sd: Standard deviation of desaturation length
- DA100\_u: Mean of desaturation area using 100% as baseline.
- DA100\_sd: Standard deviation of desaturation area using 100% as baseline
- DAmax\_u: Mean of desaturation area using max value as baseline.
- DAmax\_sd: Standard deviation of desaturation area using max value as baseline
- DD100\_u: Mean of depth desaturation from 100%.
- DD100\_sd: Standard deviation of depth desaturation from 100%.
- DDmax\_u: Mean of depth desaturation from max value.
- DDmax\_sd: Standard deviation of depth desaturation from max value.
- DS\_u: Mean of the desaturation slope.
- DS\_sd: Standard deviation of the desaturation slope.
- TD\_u: Mean of time between two consecutive desaturation events.
- TD sd: Standard deviation of time between 2 consecutive desaturation events.

#### Example:

```
from pobm.obm.desat import DesaturationsMeasures

# Initialize the class with the desired parameters
desat_class = DesaturationsMeasures(ODI_Threshold=3)

# Compute the biomarkers
results_desat = desat_class.compute(spo2_signal)
```

#### desaturation\_detector(signal)

run desaturation detector, implemented by Dr. Joachim Behar

**Parameters signal** – The SpO2 signal, of shape (N,)

#### Returns

#### **ODIMeasureResult class containing the following features:**

- ODI: the average number of desaturation events per hour.
- begin: List of indices of beginning of each desaturation event.

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• end: List of indices of end of each desaturation event.

```
\verb"pobm.obm.desat.desat_embedding" (\textit{begin}, \textit{end})
```

Help function for the class

**Returns** helper arrays containing the information about desaturation lengths and areas.

#### 1.1.1.5 pobm.obm.general

```
class pobm.obm.general.OverallGeneralMeasures (ZC\_Baseline=None, percentile=1, M\_Threshold=2, DI\_Window=12)
Bases: object
```

Class that calculates Overall General Features from spo2 time series. Suppose that the data has been preprocessed.

#### **Parameters**

- **ZC\_Baseline** Baseline for calculating number of zero-crossing points.
- **percentile** Percentile to perform. For example, for percentile 1, the argument should be 1
- M\_Threshold Percentage of the signal M\_Threshold % below median oxygen saturation. Typically use 1,2 or 5

 $compute(signal) \rightarrow pobm.\_ResultsClasses.OverallGeneralMeasuresResult$ 

**Parameters** signal – 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal

#### Returns

#### OveralGeneralMeasuresResult class containing the following features:

- AV: Average of the signal.
- MED: Median of the signal.
- Min: Minimum value of the signal.
- SD: Std of the signal.
- RG: SpO2 range (difference between the max and min value).
- P: percentile.
- M: Percentage of the signal x% below median oxygen saturation.
- ZC: Number of zero-crossing points.
- DI: Delta Index.

#### Example:

#### 1.1.1.6 pobm.obm.periodicity

```
class pobm.obm.periodicity.PRSAMeasures (PRSA_Window=10, K_AC=2)
    Bases: object
```

Function that calculates PRSA Features from spo2 time series. Suppose that the data has been preprocessed.

**:param** PRSA\_Window: Fragment duration of PRSA. K\_AC: Number of values to shift when computing autocorrelation

```
compute(signal) \rightarrow pobm.\_ResultsClasses.PRSAResults
```

Parameters signal – 1-d array, of shape (N,) where N is the length of the signal

#### Returns

#### PRSAResults class containing the following features:

- PRSAc: PRSA capacity.
- PRSAad: PRSA amplitude difference.
- PRSAos: PRSA overall slope.
- PRSAsb: PRSA slope before the anchor point.
- PRSAsa: PRSA slope after the anchor point.
- AC: Autocorrelation.

#### Example:

```
from pobm.obm.periodicity import PRSAMeasures

# Initialize the class with the desired parameters
prsa_class = PRSAMeasures(PRSA_Window=10, K_AC=2)

# Compute the biomarkers
results_PRSA = prsa_class.compute(spo2_signal)
```

#### class pobm.obm.periodicity.PSDMeasures

Bases: object

Function that calculates PSD Features from spo2 time series. Suppose that the data has been preprocessed.

```
\textbf{compute} \ (\textit{signal}) \ \rightarrow \text{pobm.\_ResultsClasses.PSDResults}
```

:param signal: The SpO2 signal, of shape (N,)

#### Returns

#### PSDResults class containing the following features:

- PSD\_total: The amplitude of the spectral signal.
- PSD\_band: The amplitude of the signal multiplied by a band-pass filter between 0.014 and 0.033 Hz.
- PSD\_ratio: The ratio between PSD\_total and PSD\_band.
- PDS\_peak: The max value of the FFT into the band 0.014-0.033 Hz.

#### Example:

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```
from pobm.obm.periodicity import PSDMeasures

# Initialize the class with the desired parameters
psd_class = PSDMeasures()

# Compute the biomarkers
results_PSD = psd_class.compute(spo2_signal)
```

#### 1.1.1.7 Module contents

### 1.1.2 pobm.spo2 package

#### 1.1.2.1 Submodules

#### 1.1.2.2 pobm.spo2.single biomarkers

```
pobm.spo2.single_biomarkers.apen (signal, M_ApEn=2, R_ApEn=0.25)
```

Compute the approximate entropy, according to the paper Utility of Approximate Entropy From Overnight Pulse Oximetry Data in the Diagnosis of the Obstructive Sleep Apnea Syndrome

**Parameters** signal – 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal

Returns ApEn

#### **Parameters**

- signal 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal
- DFA\_Window Length of window to calculate DFA biomarker.

#### Returns DFA

```
pobm.spo2.single_biomarkers.lempel_ziv(signal)
```

Compute lempel-ziv, according to the paper Non-linear characteristics of blood oxygen saturation from nocturnal oximetry for obstructive sleep apnoea detection

Parameters signal – 1-d array, of shape (N,) where N is the length of the signal

#### Returns LZ

```
pobm.spo2.single_biomarkers.odi(signal, ODI_Threshold=3)
```

Calculates the ODI from spo2 time series. Suppose that the data has been preprocessed.

#### **Parameters**

- signal The SpO2 signal, of shape (N,)
- **ODI\_Threshold** Threshold to compute Oxygen Desaturation Index.

#### Returns ODI

```
pobm.spo2.single_biomarkers.sampen(signal, M_Sampen=3, R_Sampen=0.2)
Compute the Sample Entropy
```

#### **Parameters**

- **signal** 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal
- **M\_Sampen** Embedding dimension to compute SampEn.

• **R\_Sampen** – Tolerance to compute SampEn.

Returns SampEn

#### 1.1.2.3 Module contents

### 1.2 Submodules

### 1.3 pobm.main

### 1.4 pobm.prep

```
pobm.prep.block_data (signal, treshold=50)
Apply a block data filter to the SpO2 signal.
```

#### **Parameters**

- **signal** 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal
- **(Optional)** (*treshold*) treshold parameter for block data filter.

**Returns** preprocessed signal, 1-d numpy array.

```
pobm.prep.dfilter(signal, Diff=4)
Apply Delta Filter to the signal.
```

#### **Parameters**

- **signal** 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal
- Diff parameter of the delta filter.

**Returns** preprocessed signal, 1-d numpy array.

```
pobm.prep.median spo2 (signal spo2, FilterLength=9)
```

Apply a median filter to the SpO2 signal. Median filter used to smooth the spo2 time series and avoid sporadic increase/decrease of spo2 which could affect the detection of the desaturations. Assumption: any missing/abnormal values are represented as 'np.nan'

#### **Parameters**

- **signal** 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal
- (Optional) (FilterLength) The length of the filter.

**Returns** preprocessed signal, 1-d numpy array.

```
pobm.prep.resamp_spo2 (signal, OriginalFreq)
```

Resample the SpO2 signal to 1Hz. Assumption: any missing/abnormal values are represented as 'np.nan'

#### **Parameters**

- signal 1-d array, of shape (N,) where N is the length of the signal
- OriginalFreq the original frequency.

**Returns** resampled signal, 1-d numpy array, the resampled spo2 time series at 1Hz

```
pobm.prep.set_range(signal, Range_min=50, Range_max=100)
```

Range function. Remove values lower than 50 or greater than 100, considered as non-physiological

**Parameters** signal – 1-d array, of shape (N<sub>1</sub>) where N is the length of the signal

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**Returns** preprocessed signal, 1-d numpy array.

# 1.5 Module contents

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