sport-activities-features

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sport-activities-features is a minimalistic toolbox for extracting features from sports activity files written in Python.

• Free software: MIT license

• **Github repository:** https://github.com/firefly-cpp/sport-activities-features

• **Python versions:** 3.6.x, 3.7.x, 3.8.x, 3.9.x, 3.10.x, 3.11.x

USER DOCUMENTATION

CHAPTER

ONE

GENERAL OUTLINE OF THE FRAMEWORK

Monitoring sports activities produce many geographic, topologic, and personalized data, with a vast majority of details hidden [1]. Thus, a rigorous ex-post data analysis and statistic evaluation are required to extract them. Namely, most mainstream solutions for analyzing sports activities files rely on integral metrics, such as total duration, total distance, and average hearth rate, which may suffer from the "overall (integral) metrics problem". Among others, such problems are expressed in capturing sports activities in general only (omitting crucial components), calculating potentially fallacious and misleading metrics, not recognizing different stages/phases of the sports activity (warm-up, endurance, intervals), and others [2].

The sport-activities-framework, on the other side, offers a detailed insight into the sports activity files. The framework supports both identification and extraction methods, such as identifying the number of hills, extracting the average altitudes of identified hills, measuring the total distance of identified hills, deriving climbing ratios (total distance of identified hills vs. total distance), average/total ascents of hills and so much more. The framework also integrates many other extensions, among others, historical weather parsing, statistical evaluations, and ex-post visualizations. Previous work on these topical questions was addressed in [3] relevant scientific papers on data mining, also in combination with the generating/predicting automated sport training sessions.

DETAILED INSIGHTS

The sport-activities-features framework is compatible with TCX & GPX activity files and Overpass API nodes. Current version withholds (but is not limited to) the following functions:

- extracting integral metrics, such as total distance, total duration, calories (see example),
- extracting topographic features, such as number of hills, the average altitude of identified hills, a total distance of identified hills, climbing ratio, the average ascent of hills, total ascent, total descent (see example),
- plotting identified hills (see example),
- extracting the intervals, such as number of intervals, maximum/minimum/average duration of intervals, maximum/minimum/average distance of intervals, maximum/minimum/average heart rate during intervals,
- plotting the identified intervals (see example),
- calculating the training loads, such as Bannister TRIMP, Lucia TRIMP (see example),
- parsing the historical weather data from an external service,
- extracting the integral metrics of the activity inside the area given with coordinates (distance, heartrate, speed) (see example),
- extracting the activities from CSV file(s) and randomly selecting the specific number of activities (see example),
- extracting the dead ends (see example),
- converting TCX to GPX (see example),
- · and much more.

The framework comes with two (testing) benchmark datasets, which are freely available to download from: DATASET1, DATASET2.

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THREE

HISTORICAL WEATHER DATA

Weather data is collected from the Visual Crossing Weather API. Please note that this is an external unaffiliated service, and users must register to use the API. The service has a free tier (1000 Weather reports/day) but otherwise operates on a pay-as-you-go model. For pricing and terms of use, please read the official documentation of the API provider.

CHAPTER

FOUR

DOCUMENTATION

The main documentation is organized into a couple of sections:

- User Documentation
- Developer Documentation
- About

4.1 Getting Started

This section is going to show you how to use the sport-activities-features toolbox.

4.1.1 Installation

Firstly, install sport-activities-features package using the following command:

```
pip install sport-activities-features
```

To install sport-activities-features on Fedora, use:

dnf install python3-sport-activities-features

To install sport-activities-features on Arch Linux, please use an AUR helper:

yay -Syyu python-sport-activities-features

To install sport-activities-features on Alpine, use:

apk add py3-sport-activities-features

After the successful installation you are ready to run your first example.

4.1.2 Examples

You can find usage examples here.

4.2 Installation

4.2.1 Setup development environment

Requirements

• Poetry: https://python-poetry.org/docs/

After installing Poetry and cloning the project from GitHub, you should run the following command from the root of the cloned project:

\$ poetry install

All of the project's dependencies should be installed and the project ready for further development. **Note that Poetry creates a separate virtual environment for your project.**

Development dependencies

List of sport-activities-features dependencies:

Package	Version	Platform
geopy	^2.0.0	All
matplotlib	^3.3.3	All
texreader	^0.3.10	All
requests	^2.25.1	All
niaaml	^1.1.6	All
overpy	^1.23.1	All
gpxpy	^1.4.2	All
geotiler	^0.14.5	All
numpy	^1.23.1	All
dotmap	^1.3.25	All

List of development dependencies:

Package	Version	Platform
Sphinx	^3.5.1	Any
sphinx-rtd-theme	^0.5.1	Any

4.3 Testing

Before making a pull request, if possible provide tests for added features or bug fixes.

In case any of the test cases fails, those should be fixed before we merge your pull request to master branch.

For the purpose of checking if all test are passing locally you can run following command:

\$ poetry run python -m unittest discover

4.4 Documentation

To locally generate and preview documentation run the following command in the project root folder:

```
$ poetry run sphinx-build ./docs ./docs/_build
```

If the build of the documentation is successful, you can preview the documentation in the docs/_build folder by clicking the index.html file.

4.5 API

This is the sport-activities-features API documentation, auto generated from the source code.

4.5.1 Activity generator

class sport_activities_features.activity_generator.SportyDataGen(**kwargs)

Bases: object

Class that contains selected and modified SportyDataGen methods for generation of sports activity collections.

Parameters

**kwargs - various arguments

Reference:

Fister Jr., I., Vrbančič, G., Brezočnik, L., Podgorelec, V., & Fister, I. (2018). SportyDataGen: An Online Generator of Endurance

Sports Activity Collections.

In Central European Conference on Information and Intelligent Systems (pp. 171-178). Faculty of Organization and Informatics Varazdin.

Reference URL:

http://www.iztok-jr-fister.eu/static/publications/225.pdf

Note: [WIP] This class is still under developement, therefore its methods may not work as expected.

4.3. Testing

$random_generation_without_clustering(activities) \rightarrow None$

Method for the random generation of sport activities (without clustering).

Parameters

activities -

Note: Select n activities randomly without any special preprocessing tasks.

4.5.2 Area Identification

class sport_activities_features.area_identification.AreaIdentification(positions: array,

distances: array, timestamps: array, heart_rates: array, area_coordinates: array)

Bases: object

Area identification based by coordinates.

Parameters

- positions (np.array) coordinates of positions as an array of latitudes and longitudes
- **distances** (*np.array*) cummulative distances as an array of floats
- timestamps (np.array) information about time as an array of datetimes
- heart_rates (np.array) heart rates as an array of integers
- **area_coordinates** (*np.array*) coordinates of the area where data is analysed as an array of latitudes and longitudes

Reference:

L. Lukač, "Extraction and Analysis of Sport Activity Data Inside Certain Area", 7th Student Computer Science Research Conference StuCoSReC, 2021, pp. 47-50, doi: https://doi.org/10.18690/978-961-286-516-0.9

do_two_line_segments_intersect(p1: array, p2: array, p3: array, p4: array) \rightarrow bool

Method for checking whether two line segments have an intersection point.

Parameters

- p1 (np.array) first point of the first line as a pair of coordinates
- **p2** (*np.array*) second point of the first line as a pair of coordinates
- p3 (np.array) first point of the second line as a pair of coordinates
- **p4** (*np.array*) second point of the second line as a pair of coordinates

Returns

True if the two lines have an intersection point, False otherwise

Return type

bool

static draw_activities_inside_area_on_map(activities: array, area_coordinates: array) \rightarrow None Static method for drawing all the activities inside of an area on the map.

Parameters

- activities (np. array) array of AreaIdentification objects
- **area_coordinates** (*np.array*) border coordinates of an area as an array of latitudes and longitudes

```
draw_map() \rightarrow None
```

Method for the visualization of the exercise on the map using Geotiler.

```
extract_data_in_area() \rightarrow dict
```

Method for extracting the data of the identified points in area.

```
Returns: area_data: {
```

```
'distance': distance, 'time': time, 'average_speed': average_speed, 'minimum_heart_rate': minimum_heart_rate, 'maximum_heart_rate': maximum_heart_rate, 'average_heart_rate': average_heart_rate
```

}

static get_area_coordinates_around_point(point: array, distance: int) → array

Static method to get area coordinates around the point on Earth according to given distance. Area limits consist of 4 border points.

Parameters

- **point** (*np.array*) a pair of Earth coordinates
- distance (int) desired distance from given point to area border points

Returns

an array of area coordinates

Return type

np.array

identify_points_in_area() → None

Method for identifying the measure points of the activity inside of the specified area.

```
is_equal(value_1: float, value_2: float) → bool
```

Method for checking whether the two float values are equal with certain tolerance (because of round error).

Parameters

- value_1 (float) first value
- value_2 (float) second value

Returns

True if the two values are equal, false otherwise

Return type

bool

static plot_activities_inside_area_on_map(activities: array, area_coordinates: array) \rightarrow None Static method for plotting the area borders and the activities (or their parts) inside of an area.

Parameters

• activities (np. array) – array of AreaIdentification objects

• area_coordinates (np.array) – border coordinates of an area as an array of latitudes and longitudes

```
plot_map() \rightarrow None
```

Method for plotting the map using Geotiler according to the object variables.

4.5.3 Classes

class sport_activities_features.classes.StoredSegments(segment, ascent, average_slope=None)

Bases: object

Class for stored segments.

Parameters

- () (ascent) -
- O -
- average_slope() -

Note: [WIP] This class is still under development, therefore its methods may not work as expected.

4.5.4 Data Analysis

class sport_activities_features.data_analysis.DataAnalysis(**kwargs)

Bases: object

Class for data analysis that uses automated machine learning to analyze extracted sport features.

Parameters

```
**kwargs – various arguments
```

analyze_data($src: str, fitness_name: str, population_size: uint64, number_of_evaluations: uint64, optimization_algorithm: str, classifiers: Iterable, feature_selection_algorithms: Iterable | None = None, feature_transform_algorithms: Iterable | None = None, imputer: <math>str \mid None = None$) \rightarrow Pipeline

Method for running AutoML process using NiaAML PipelineOptimizer class instance.

Parameters

- **src** (*str*) path to a CSV file
- **fitness_name** (*str*) name of the fitness class to use as a function
- population_size (uint) number of individuals in the optimization process
- number_of_evaluations (uint) number of maximum evaluations
- $optimization_algorithm(str)$ name of the optimization algorithm to use
- **classifiers** (*Iterable* [*Classifier*]) array of names of possible classifiers
- **feature_selection_algorithms** (*Optional[Iterable[str]]*) array of names of possible feature selection algorithms
- **feature_transform_algorithms** (Optional[Iterable[str]]) array of names of possible feature transform algorithms

• **imputer** (Optional[str]) — name of the imputer used for features that contain missing values

Returns

instance of Pipeline object from the NiaAML framework

Return type

Pipeline

Note: See NiaAML's documentation for more details on possible input parameters' values and further usage of the returned Pipeline object.

```
static load_pipeline(file_name: str) → Pipeline
```

Method for loading a NiaAML's pipeline from a binary file.

Parameters

file_name (str) – path to a binary pipeline file

Note: See NiaAML's documentation for more details on the use of the Pipeline class.

4.5.5 Data Extraction

```
class sport_activities_features.data_extraction.DataExtraction(activities: list)
```

Bases: object

Class for storing activities' analysed data in CSV files.

Parameters

activities (list) – list of activities

```
extract_data(path: str) \rightarrow None
```

This method is used for extracting the data of the activities into separate CSV files.

Parameters

path (str) – absolute path where the CSV files should be saved

4.5.6 Data Extraction from csv files

```
{\bf class} \  \, {\bf sport\_activities\_features.data\_extraction\_from\_csv.} \\ {\bf DataExtractionFromCSV} (\it activities: list | None = | Color | None | Color | N
```

None)

Bases: object

Class for extracting data from CSV files.

Parameters

activities (list) – list of activities

```
from_all_files(path: str) \rightarrow list
```

Method for extracting data to list of dataframes from all CSV files in the folder.

Parameters

path (str) – absolute path to the folder with CSV files

Returns

list of activities

Return type

list

from_file(path: str) \rightarrow list

Method for extracting data from CSV file to dataframe.

Parameters

path (str) – absolute path to the CSV file

Returns

list of activities

Return type

list

 $select_random_activities(number: int) \rightarrow list$

Method for selecting random activities.

Parameters

number (int) – desired number of random activities

Returns

list of random activities

Return type

list

4.5.7 Dead End Identification

class sport_activities_features.dead_end_identification.DeadEndIdentification(positions:

array,
distances:
array, tolerance_degrees:
float = 5.0,
tolerance_position:
float = 5.0,
minimum_distance:
int = 500,
U_turn_allowed_distance:
int = 50)

Bases: object

Class for identifying and visualising dead ends in an exercise. Dead end is a part of an exercise, where an athlete suddenly makes a U-turn takes the same path as before the U-turn is conducted in the opposite direction.

Parameters

- **positions** (*np.array*) array of positions as pairs of latitudes and longitudes
- **distances** (*np.array*) array of cumulative distances
- **tolerance_degrees** (*float*) tolerance of driving the same route in the opposite direction given in degrees

- tolerance_position (float) tolerance of positions given in meters
- minimum_distance (int) minimum distance of a dead end
- **U_turn_allowed_distance** (*int*) maximum distance of a U-turn while turning around and starting a dead end

Note: [WIP] This class is still under development, therefore its methods may not work as expected.

$draw_map() \rightarrow None$

Method for visualisation of the exercise with identified dead ends.

$identify_dead_ends() \rightarrow None$

Method for identifying dead ends of the exercise.

 $is_dead_end(azimuth_1: float, azimuth_2: float, tolerance_azimuth: float) \rightarrow bool$

Method for checking whether two azimuths represent a part of a dead end allowing the given tolerance.

Parameters

- azimuth_1 (float) first azimuth
- azimuth_2 (float) second azimuth
- tolerance_azimuth (float) difference tolerance of the two azimuths

Returns

True if given azimuths are within the given tolerance,

False otherwise

Return type

bool

 $long_enough_to_be_a_dead_end(start_distance: float, finish_distance: float) \rightarrow bool$

Method for checking whether a dead end is long enough to be a dead end.

Parameters

- **start_distance** (*float*) cummulative distance at the start of the dead end
- **finish_distance** (*float*) cummulative distance at the end of the dead end

Returns

True if dead end is long enough, False otherwise

Return type

bool

really_is_dead_end($position1: array, position2: array, tolerance_coordinates: float) <math>\rightarrow$ bool Method for checking whether a dead end really is a dead end.

Parameters

- position1 (np.array) position of the first point
- position2 (np.array) position of the second point
- tolerance_coordinates (float) the tolerance between the two positions in meters

Returns

True if a track segment is a part of dead end,

False otherwise

Return type

bool

reorganize_exercise_data(positions: array, distances: array, interval_distance: int = 1) \rightarrow None

Method for reorganising the exercise in the way that the trackpoints are organized in a constant interval of distance.

Parameters

- positions (np.array) array of positions as pairs of latitudes and longitudes
- **distances** (*np.array*) array of cummulative distances
- **interval_distance** (*int*) desired distance between two neighboring points

 $show_map() \rightarrow < module 'matplotlib.pyplot' from$

'/root/.virtualenvs/sportydatagen3.10/lib/python3.10/site-packages/matplotlib/pyplot.py'>

Method for plotting the exercise with dead ends. :returns: plt

4.5.8 File Manipulation

class sport_activities_features.file_manipulation.FileManipulation

Bases: object

Superclass of GPXFile and TCXFile. Contains common methods of both classes, that have the same implementation. e.g. (filling missing values)

```
count_missing_values(list)
```

Counts the number of elements with value Nona. :param list: list to check :type list: list/ndarray

Returns

number of elements with value None in list

Return type

(int)

linear_fill_missing_values(activity, key, max_seconds=15)

Function that lineary fills missing values, if the successive missing values are up to (max_seconds) apart. :param activity: TCXReader read file :param key: dictionary key (e.g. 'heartrates', 'distances', ...) :type key: str :param max_seconds: maximum time between two valid values, :type max_seconds: int :param to still fill the missing values:

Returns

/ Transforms the sent array / list.

4.5.9 GPX Manipulation

class sport_activities_features.gpx_manipulation.GPXFile

Bases: FileManipulation

Class for reading GPX files.

```
extract_integral_metrics(filename) \rightarrow dict
```

Method for parsing one GPX file and extracting integral metrics.

Returns: int_metrics: {

```
"activity_type": activity_type, "distance": distance, "duration": duration, "calories": calo-
              ries, "hr_avg": hr_avg, "hr_max": hr_max, "hr_min": hr_min, "altitude_avg": altitude_avg,
              "altitude max": altitude max, "altitude min": altitude min, "ascent": ascent, "descent": de-
              scent.
          }
read_directory (directory name: str) \rightarrow list
     Method for finding all GPX files in a directory.
          Parameters
              directory_name (str) – name of the directory in which to identify GPX files
          Returns
              array of paths to the identified files
          Return type
              list
read_one_file(filename, numpy_array=False)
     Method for parsing one GPX file.
          Parameters
              • filename (str) – name of the TCX file to be read
              • numpy_array (boo1) – if set to true dictionary lists are transformed into numpy.arrays
     Returns: activity: {
              'activity_type': activity_type, 'positions': positions, 'altitudes': altitudes, 'distances': dis-
              tances, 'total_distance': total_distance, 'timestamps': timestamps, 'heartrates': heartrates,
              'speeds': speeds
          }
```

Note: In the case of missing value in raw data, we assign None.

class sport_activities_features.gpx_manipulation.**GPXTrackPoint**(longitude: float | None = None,

latitude: float | None = None, elevation: float | None = None, time=None, distance=None, hr_value: int | None = None, cadence=None, watts: float | None = None, speed: float | None = None)

Bases: object

Class for saving GPX point records.

Parameters

- longitude (float) longitude in degrees
- **latitude** (*float*) latitude in degrees
- **elevation** (*float*) elevation in meters
- **time** (*datetime*) datetime of time at the given point
- **distance** (*float*) total distance travelled until this point

- **hr_value** (*int*) heart beats per minute at given recording.
- cadence (int) cadence
- watts (float) watts power rating
- speed (float) speed in km/h

from_GPX($gpx: GPXTrackPoint, hr_value: int | None = None, cadence: int | None = None, watts: int | None = None) <math>\rightarrow$ None

Helper method for initialising GPXTrackPoint from the gpxpy.gpx.GpxTrackPoint.

Parameters

- **gpx** (*gpxpy.gpx.GPXTrackPoint*) gpxpy.gpx.GPXTrackPoint not to be confused with class of the same name used in gpx_manipulation
- **hr_value** (*int*) heart beats per minute at given recording
- cadence (int) cadence
- watts (int) watts power rating

4.5.10 Hills

class sport_activities_features.hill_identification.GradeUnit(value)

Bases: Enum

Enum for selecting the type of data we want returned in hill slope calculation (degrees / radians or gradient (%))

class sport_activities_features.hill_identification.HillIdentification(altitudes: List[float],

distances: List[float] |
None = None,
ascent_threshold: float
= 30)

Bases: object

Class for identification of hills from TCX file.

Parameters

- altitudes (list) an array of altitude values extracted from TCX file
- **ascent_threshold** (*float*) parameter that defines the hill (hill >= ascent_threshold)
- **distances** (*list*) optional, allows calculation of hill grades (steepnes)

 $identify_hills() \rightarrow None$

Method for identifying hills and extracting total ascent and descent from data.

Note: [WIP] Algorithm is still in its preliminary stage.

return_hill($ascent: float, ascent_threshold: float = 30$) \rightarrow bool

Method for identifying whether the hill is steep enough to be identified as a hill.

Parameters

- ascent (float) actual ascent of the hill
- ascent_threshold (float) threshold of the ascent that is used for identifying hills

Returns

True if the hill is recognised, False otherwise

Return type

bool

$return_hills() \rightarrow list$

Method for returning identified hills.

Returns

array of identified hills

Return type

list

4.5.11 Intervals

 $\textbf{class} \ \texttt{sport_activities_features.interval_identification.} \textbf{IntervalIdentificationByHeartRate} (\textit{distances:} \\$

list,
timestamps:
list,
altitudes:
list,
heart_rates:
list,
minimum_time:
int
=
30)

Bases: object

Class for identifying intervals based on heart rate.

Parameters

- **distances** (*list*) list of cumulative distances
- timestamps (list) list of timestamps
- **altitudes** (*list*) list of altitudes
- heart_rates (list) list of heart rates
- minimum_time (int) minimum time of an interval given in seconds

${\tt calculate_interval_statistics()} \rightarrow {\tt dict}$

Method for calculating interval statistics.

Returns

'min_duration_interval':
max_duration_interval,
'min_distance_interval':

'avg_duration_interval': avg_duration_interval, 'min_distance_interval':

```
min distance interval,
                                                   'max distance interval':
                                                                                      max distance interval,
                      'avg_distance_interval':
                                                       avg_distance_interval,
                                                                                    'min_heartrate_interval':
                      min heartrate interval,
                                                   'max heartrate interval':
                                                                                     max heartrate interval,
                      'avg_heartrate_interval': avg_heartrate_interval,
     identify_intervals() → None
           Method for identifying intervals from given data.
     return_intervals() \rightarrow list
           Method for retrieving identified intervals.
               Returns
                   identified intervals
               Return type
                   list
class sport_activities_features.interval_identification.IntervalIdentificationByPower(distances:
                                                                                                            list.
                                                                                                            times-
                                                                                                            tamps:
                                                                                                            list,
                                                                                                            alti-
                                                                                                            tudes:
                                                                                                            list.
                                                                                                            mass:
                                                                                                            int,
                                                                                                            min-
                                                                                                            i-
                                                                                                            mum time:
                                                                                                            int
                                                                                                            30)
     Bases: object
     Class for identifying intervals based on power.
           Parameters
                 • distances (list) – list of cumulative distances
                 • timestamps (list) – list of timestamps
                 • altitudes (list) – list of altitudes
                 • mass (int) – total mass of an athlete given in kilograms
                 • minimum_time (int) – minimum time of an interval given in seconds
     calculate_interval_statistics() → dict
           Method for calculating interval statistics.
               Returns
                   data = {
                      'number_of_intervals': number_of_intervals, 'min_duration':
                                                                                      min_duration_interval,
                      'max duration':
                                          max_duration_interval,
                                                                   'avg_duration':
                                                                                      avg_duration_interval,
                      'min_distance':
                                         min_distance_interval,
                                                                  'max_distance':
                                                                                      max_distance_interval,
                      'avg_distance': avg_distance_interval,
```

```
identify_intervals() → None
    Method for identifying intervals from given data.

return_intervals() → list
    Method for retrieving identified intervals.

Returns
    identified intervals

Return type
    list
```

4.5.12 Missing Elevation Identification

class sport_activities_features.missing_elevation_identification.ElevationIdentification(open_elevation_ap

str
=
'https://api.openelevation.com/api/
positions:
list

[])

Bases: object

Class for retrieving elevation data using Open Elevation Api.

Parameters

- **open_elevation_api** (*str*) address of the Open Elevation Api, default https://api. open-elevation.com/api/v1/lookup
- **positions** (list[(lat1, lon1), (lat2, lon2) ...])—list of tuples of latitudes and longitudes

 $fetch_elevation_data(payload_formatting: bool = True) \rightarrow list$

Method for making requests to the Open Elevation API to retrieve elevation data.

Parameters

 $payload_formatting (bool)$ - True -> break into chunks, False -> don't break self.positions into chunks

Returns

list of elevations for the given positions

Return type

list[int]

4.5.13 Overpy Node Manipulation

Bases: object

Class for working with Overpass nodes (Overpy.node). The purpose is to generate a dictionary object similar to those generated by TCXFile and GPXFile classes.

Parameters

```
open_elevation_api (str) – location of the Open Elevation Api
```

read_nodes($nodes: Node, cumulative_distances: bool = True) <math>\rightarrow$ dict

Method for reading overpy. Node nodes and generating a TCXFile/GPXFile like dictionary of objects.

Parameters

- nodes (list) list of overpy. Node objects
- **cumulative_distances** (*boo1*) If set to True, distance equals previous point distance + distance between the nodes, else tells actual distance between two points.

Returns: dictionary of nodes.

4.5.14 Plot data

class sport_activities_features.plot_data.PlotData

Bases: object

Class for plotting the extracted data.

```
draw_basic_map() \rightarrow None
```

Method for plotting the whole topographic map and rendering the plot.

 $draw_hills_in_map(altitude: list, distance: list, identified hills: list) \rightarrow None$

Method for plotting all hills identified in data on topographic map and rendering the plot.

Parameters

- altitude (list) list of altitudes
- **distance** (list) list of distances
- identified_hills (list) list of identified hills

 $draw_intervals_in_map(timestamp: list, distance: list, identified_intervals: list) <math>\rightarrow$ None

Method for plotting all intervals identified in data on topographic map and rendering the plot.

Parameters

- **timestamp** (*datetime*) list of timestamps
- distance (float) list of distances

```
• identified_intervals (list) – list of identified intervals
```

$get_positions_of_hills(identified_hills: list) \rightarrow list$

Method for retrieving positions of identified hills.

Parameters

identified_hills (list) - list of identified hills

Returns

list of hills

Return type

list

$get_positions_of_intervals(identified_intervals: list) \rightarrow list$

Method for retrieving positions of identified intervals.

Parameters

identified_intervals (list) - list of identified intervals

Returns

list of intervals

Return type

list

 $plot_basic_map(altitude: list, distance: list) \rightarrow < module 'matplotlib.pyplot' from$

'/root/.virtualenvs/sportydatagen3.10/lib/python3.10/site-packages/matplotlib/pyplot.py'>

Method for plotting the whole topographic map.

Parameters

- altitude (list) list of altitudes
- **distance** (list) list of distances

Returns

plt

plot_hills_on_map(*altitude: list, distance: list, identified_hills: list*) → <module 'matplotlib.pyplot' from '/root/.virtualenvs/sportydatagen3.10/lib/python3.10/site-packages/matplotlib/pyplot.py'>

Method for plotting all hills identified in data on topographic map.

Parameters

- altitude (list) list of altitudes
- **distance** (*list*) list of distances
- identified_hills (list) list of identified hills

Returns

plt

 $\label{eq:plot_intervals_in_map} \begin{tabular}{ll} plot_intervals: list, identified_intervals: list) \rightarrow <module 'matplotlib.pyplot' from '/root/.virtualenvs/sportydatagen3.10/lib/python3.10/site-packages/matplotlib/pyplot.py'> \end{tabular}$

Method for plotting all intervals identified in data on topographic map.

Parameters

• timestamp(list) - list of timestamps

```
• identified_intervals (list) – list of identified intervals
```

Returns

plt

4.5.15 TCX manipulation

```
class sport_activities_features.tcx_manipulation.TCXFile
      Bases: FileManipulation
      Class for reading TCX files.
      create_gps_object(path_to_the_file)
           Convert TCX file to GPX file.
      extract_integral_metrics(filename: str) \rightarrow dict
           Method for parsing one TCX file and extracting integral metrics.
                Parameters
                    filename (str) – name of the TCX file to be read
                Returns
                    int metrics = {
                      'activity_type': activity_type, 'distance': distance, 'duration': duration, 'calories': calo-
                      ries, 'hr_avg': hr_avg, 'hr_max': hr_max, 'hr_min': hr_min, 'altitude_avg': altitude_avg,
                      'altitude_max': altitude_min': altitude_min, 'ascent': ascent, 'descent':
                      descent, 'steps': steps
      read_directory(directory\_name: str) \rightarrow list
           Method for finding all TCX files in a directory.
                Parameters
                    directory_name (str) – name of the directory in which to identify TCX files
                    array of paths to the identified files
                Return type
      read\_one\_file(filename: str, numpy\_array=False) \rightarrow dict
           Method for parsing one TCX file using the TCXReader.
                Parameters
                    • filename (str) – name of the TCX file to be read
                    • numpy_array (bool) -
                      if set to true dictionary lists are
                         transformed into numpy.arrays
                Returns
                    activity = {
                      'activity_type': activity_type, 'positions': positions, 'altitudes': altitudes, 'distances': dis-
                      tances, 'total_distance': total_distance, 'timestamps': timestamps, 'heartrates': heartrates,
                      'speeds': speeds
```

}

Note: In the case of missing value in raw data, we assign None.

```
write_gpx(gps_object, output_file_name=None)
```

Write GPX object to file. if output_file_name is not specified, the output file name will be the same as the input file name, but with .gpx extension.

4.5.16 Topographic features

class sport_activities_features.topographic_features.TopographicFeatures(identified_hills: list)

Bases: object

Class for feature extraction from topographic maps.

Parameters

identified_hills (*list*) – identified hills are now passed to this class

ascent($altitude_data: list$) \rightarrow float

Method for ascent calculation.

Parameters

altitude_data (list) – list of altitudes

Returns

total ascent

Return type

float

Note: [WIP] This method should be improved.

```
avg_altitude_of_hills(alts: list) \rightarrow float
```

Method for calculating the average altitude of all identified hills in sport activity.

Parameters

alts (list) – list of altitudes

Returns

average altitude

Return type

float

$avg_ascent_of_hills(alts: list) \rightarrow float$

Method for calculating the average ascent of all hills in sport activity.

Parameters

alts (list) – list of altitudes

Returns

average ascent

Return type

float

calculate_distance($latitude_1$: float, $latitude_2$: float, $longitude_1$: float, $longitude_2$: float) \rightarrow float Method for calculating the distance between the two pairs of coordinates.

Parameters

- latitude_1 (float) first latitude
- latitude_2 (float) second latitude
- longitude_1 (float) first longitude
- longitude_2 (float) second longitude

Returns

distance in kilometers

Return type

float

calculate_hill_gradient($latitude_1$: float, $latitude_2$: float, $longitude_1$: float, $longitude_2$: float, $height_1$: float, $height_2$: float) \rightarrow float

Method for calculation of the hill gradient in percent.

Parameters

- latitude_1 (float) first latitude
- latitude_2 (float) second latitude
- longitude_1 (float) first longitude
- longitude_2 (float) second longitude
- height_1 (float) first altitude
- height_2 (float) second altitude

Returns

gradient in degrees

Return type

float

descent($altitude_data: list$) \rightarrow float

Method for descent calculation.

Parameters

altitude_data (*list*) – list of altitudes

Returns

total descent

Return type

float

Note: [WIP] This method should be improved.

```
distance\_of\_hills(positions: list) \rightarrow float
```

Method for calculating the total distance of all identified hills in sport activity.

Parameters

positions (*1ist*) – list of positions

Returns

distance of hills

Return type

float

```
\textbf{num\_of\_hills()} \rightarrow \text{int}
```

Method for calculating the number of identified hills in sport activity.

Returns

number of hills

Return type

int

 $share_of_hills(hills_dist: float, total_dist: float) \rightarrow float$

Method for calculating the share of hills in sport activity (percentage).

Parameters

- hills_dict (float) distance of all hills
- total_dist (float) total distance

Returns

share of hills

Return type

float

4.5.17 Training loads

This class is used for calculation of training loads.

Bases: object

Class for calculation of simple Banister's TRIMP.

Reference paper:

Banister, Eric W. "Modeling elite athletic performance." Physiological testing of elite athletes 347 (1991): 403-422.

Parameters

- **duration** (*float*) total duration in seconds
- average_heart_rate (float) average heart rate in beats per minute

$calculate_TRIMP() \rightarrow float$

Method for the calculation of the TRIMP.

Returns

Banister TRIMP value

Return type

float

class sport_activities_features.training_loads.BanisterTRIMPv2(duration: float,

average_heart_rate: float,
min_heart_rate: float,
max_heart_rate: float, gender:
Gender = Gender.male)

Bases: object

Class for calculation of Banister's TRIMP.

Reference paper:

Banister, Eric W. "Modeling elite athletic performance." Physiological testing of elite athletes 347 (1991): 403-422.

Parameters

- **duration** (*float*) total duration in seconds
- average_heart_rate (float) average heart rate in beats per minute
- min_heart_rate (float) minimum heart rate in beats per minute
- max_heart_rate (float) maximum heart rate in beats per minute
- **gender** (Gender) gender enum of athlete (default male, female)

$calculate_TRIMP() \rightarrow float$

Calculate TRIMP.

Returns

float: Banister TRIMP value.

calculate_delta_hr_ratio() → float

Calculate the delta heart rate.

The ratio ranges from a low to a high value (i.e., $\sim 0.2 - 1.0$) for a low or a high raw heart rate, respectively.

Returns

float: delta heart rate.

$calculate_weighting_factor(delta_hr_ratio: float) \rightarrow float$

Calculate the weighting factor.

Returns

float: weighting factor (Y).

Bases: object

Class for calculation of Edwards TRIMP.

Reference paper:

https://www.frontiersin.org/articles/10.3389/fphys.2020.00480/full

Parameters

- heart_rates (list[int]) list of heart rates in beats per minute
- **timestamps** (*list[timestamp]*) list of timestamps
- max_heart_rate (int) maximum heart rate of an athlete

```
calculate\_TRIMP() \rightarrow float
```

Method for the calculation of the TRIMP.

Returns

Edwards TRIMP value

Return type

float

class sport_activities_features.training_loads.**Gender**(value)

Bases: Enum

Gender Enum.

class sport_activities_features.training_loads.LuciaTRIMP(heart_rates: list, timestamps: list, VT1: int = 160, VT2: int = 180)

Bases: object

Class for calculation of Lucia's TRIMP.

Reference:

https://www.trainingimpulse.com/lucias-trimp-0

Parameters

- heart_rates (list[int]) list of heart rates in beats per minute
- **timestamps** (*list[timestamp]*) list of timestamps
- VT1 (int) ventilatory threshold to divide the low and the moderate zone
- VT2 (int) ventilatory threshold to divide the moderate and the high zone

$calculate_TRIMP() \rightarrow float$

Method for the calculation of the TRIMP.

Returns

Lucia's TRIMP value

Return type

float

4.5.18 Weather Identification

 $\textbf{class} \ \ \textbf{sport_activities_features.weather_identification.} \\ \textbf{WeatherIdentification} (\textit{locations: list}, \textit{list}, \textit{li$

timestamps:

 $list, vc_api_key:$

str,

unit_group='metric')

Bases: object

A class used for identification of Weather data from TCX file. For identification of weather an external API is used (https://www.visualcrossing.com/).

Parameters

• **locations** (list[(float, float)]) – coordinates of exercise recordings, found in TCXFile/GPXFile generated dictionary under "positions"

- **timestamps** (list[datetime]) timestamps of exercise recordings, found in TCX-File/GPXFile generated dictionary under "timestamps"
- vc_api_key (str) API key for accessing VisualCrossing weather data
- unit_group (str) Unit group of data recieved. Possible options 'metric' (default), 'us', 'uk', 'base'.

Warning: vc_api_key: api key is required

classmethod get_average_weather_data(timestamps: list, weather: list) \rightarrow list

Method generates average weather for each of the timestamps in training by averaging the weather before and after the timestamp, using the __find_nearest_weathers() method.

Parameters

- timestamps (list[datetime]) datetime recordings from the TCXFile parsed data
- weather (list[Weather]) list of weather objects retrieved from VisualCrossing API

Returns

list which is an AverageWeather object

for each of the given timestamps

Return type

list[AverageWeather]

```
get_weather(time\_delta: int = 30) \rightarrow list
```

Method that queries the VisualCrossing weather API for meteorological data at provided (minute) time intervals.

Parameters

time_delta (int) – time between two measurements, default 30 mins

Returns

list of Weather objects from the nearest

meteorological station for every interval (time_delta minutes) of training

Return type

list[Weather]

4.6 Contributing to sport-activities-features

First off, thanks for taking the time to contribute!

4.6.1 Code of Conduct

This project and everyone participating in it is governed by the *Contributor Covenant Code of Conduct*. By participating, you are expected to uphold this code. Please report unacceptable behavior to iztok.fister1@um.si.

4.6.2 How Can I Contribute?

Reporting Bugs

Before creating bug reports, please check existing issues list as you might find out that you don't need to create one. When you are creating a bug report, please include as many details as possible in the issue template.

Suggesting Enhancements

Open new issue using the feature request template.

Pull requests

Fill in the pull request template and make sure your code is documented.

4.7 Contributor Covenant Code of Conduct

4.7.1 Our Pledge

We as members, contributors, and leaders pledge to make participation in our community a harassment-free experience for everyone, regardless of age, body size, visible or invisible disability, ethnicity, sex characteristics, gender identity and expression, level of experience, education, socio-economic status, nationality, personal appearance, race, religion, or sexual identity and orientation.

We pledge to act and interact in ways that contribute to an open, welcoming, diverse, inclusive, and healthy community.

4.7.2 Our Standards

Examples of behavior that contributes to a positive environment for our community include:

- · Demonstrating empathy and kindness toward other people
- Being respectful of differing opinions, viewpoints, and experiences
- Giving and gracefully accepting constructive feedback
- · Accepting responsibility and apologizing to those affected by our mistakes, and learning from the experience
- Focusing on what is best not just for us as individuals, but for the overall community

Examples of unacceptable behavior include:

- · The use of sexualized language or imagery, and sexual attention or advances of any kind
- Trolling, insulting or derogatory comments, and personal or political attacks
- · Public or private harassment
- Publishing others' private information, such as a physical or email address, without their explicit permission

Other conduct which could reasonably be considered inappropriate in a professional setting

4.7.3 Enforcement Responsibilities

Community leaders are responsible for clarifying and enforcing our standards of acceptable behavior and will take appropriate and fair corrective action in response to any behavior that they deem inappropriate, threatening, offensive, or harmful.

Community leaders have the right and responsibility to remove, edit, or reject comments, commits, code, wiki edits, issues, and other contributions that are not aligned to this Code of Conduct, and will communicate reasons for moderation decisions when appropriate.

4.7.4 Scope

This Code of Conduct applies within all community spaces, and also applies when an individual is officially representing the community in public spaces. Examples of representing our community include using an official e-mail address, posting via an official social media account, or acting as an appointed representative at an online or offline event.

4.7.5 Enforcement

Instances of abusive, harassing, or otherwise unacceptable behavior may be reported to the community leaders responsible for enforcement at iztok.fister1@um.si. All complaints will be reviewed and investigated promptly and fairly.

All community leaders are obligated to respect the privacy and security of the reporter of any incident.

4.7.6 Enforcement Guidelines

Community leaders will follow these Community Impact Guidelines in determining the consequences for any action they deem in violation of this Code of Conduct:

1. Correction

Community Impact: Use of inappropriate language or other behavior deemed unprofessional or unwelcome in the community.

Consequence: A private, written warning from community leaders, providing clarity around the nature of the violation and an explanation of why the behavior was inappropriate. A public apology may be requested.

2. Warning

Community Impact: A violation through a single incident or series of actions.

Consequence: A warning with consequences for continued behavior. No interaction with the people involved, including unsolicited interaction with those enforcing the Code of Conduct, for a specified period of time. This includes avoiding interactions in community spaces as well as external channels like social media. Violating these terms may lead to a temporary or permanent ban.

3. Temporary Ban

Community Impact: A serious violation of community standards, including sustained inappropriate behavior.

Consequence: A temporary ban from any sort of interaction or public communication with the community for a specified period of time. No public or private interaction with the people involved, including unsolicited interaction with those enforcing the Code of Conduct, is allowed during this period. Violating these terms may lead to a permanent ban.

4. Permanent Ban

Community Impact: Demonstrating a pattern of violation of community standards, including sustained inappropriate behavior, harassment of an individual, or aggression toward or disparagement of classes of individuals.

Consequence: A permanent ban from any sort of public interaction within the community.

4.7.7 Attribution

This Code of Conduct is adapted from the Contributor Covenant, version 2.0, available at https://www.contributor-covenant.org/version/2/0/code_of_conduct.html.

Community Impact Guidelines were inspired by Mozilla's code of conduct enforcement ladder.

For answers to common questions about this code of conduct, see the FAQ at https://www.contributor-covenant.org/faq. Translations are available at https://www.contributor-covenant.org/translations.

4.8 Contributors

4.8.1 Credits

Maintainers

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Contributors (alphabetically)

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- Rok Kukovec
- · Luka Lukač
- · Luka Pečnik
- Špela Pečnik
- Alen Rajšp

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4.9 License

MIT License

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