hdhp.py Documentation

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Contents

CHAPTER 1

The `infer` function

hdhp.**infer**(*history*, *alpha_0*, *mu_0*, *omega=1*, *beta=1*, *theta_0=None*, *threads=1*, *num_particles=1*, *particle_weight_threshold=1*, *resample_every=10*, *update_kernels=True*, *mu_rate=0.6*, *keep_alpha_history=False*, *progress_file=None*, *seed=None*)

Runs the inference algorithm and returns a particle.

Parameters

- **history** (*list*) – A list of 4-tuples (user, time, content, metadata) that represents the event history that we want to infer our model on.
- **alpha_0** (*tuple*) – The Gamma prior parameter for a pattern's time kernel.
- **mu_0** (*tuple*) – The Gamma prior parameter for the user activity rate.
- **omega** (*float*) – The time decay parameter.
- **beta** (*float*) – A parameter that controls the new-task probability.
- **theta_0** (*list, default is None*) – If not None, theta_0 corresponds to the Dirichlet prior used for the word distribution. It should have as many dimensions as the number of words. By default, this is the vector $[1/|V|, \ldots, 1/|V|]$, where $|V|$ is the size of the vocabulary.
- **threads** (*int, default is 1*) – The number of CPU threads that will be used during inference.
- **num_particles** (*int, default is 1*) – The number of particles that the SMC algorithm will use.
- **particle_weight_threshold** (*float, default is 1*) – A parameter that controls when the particles need to be resampled
- **resample_every** (*int, default is 10*) – The frequency with which we check if we need to resample or not. The number is in inference steps (number of events)
- **update_kernels** (*bool, default is True*) – Controls wheter the time kernel parameter of each pattern will be updated from the posterior, or not.

- **mu_rate** (*float, default is 0.6*) – The learning-rate with which we update the activity rate of a user.
- **keep_alpha_history** (*bool, default is False*) – For debug reasons, we make want to keep the complete history of the value of each pattern's time kernel parameter as we see more events in that pattern.
- **progress_file** (*str, default is None*) – Since the computation might be slow, we want to save progress information to a file instead of printing it. If None, a temporary, randomly-named file is generated for this purpose.

CHAPTER 2

The HDHProcess object

class hdhp.**HDHProcess**(*num_patterns*, *alpha_0*, *mu_0*, *vocabulary*, *omega=1*, *doc_length=20*, *doc_min_length=5*, *words_per_pattern=10*, *random_state=None*)

__init__(*num_patterns*, *alpha_0*, *mu_0*, *vocabulary*, *omega=1*, *doc_length=20*, *doc_min_length=5*, *words_per_pattern=10*, *random_state=None*)

Parameters

- **num_patterns** (*int*) – The maximum number of patterns that will be shared across the users.
- **alpha_0** (*tuple*) – The parameter that is used when sampling the time kernel weights of each pattern. The distribution that is being used is a Gamma. This tuple should be of the form (shape, scale).
- **mu_0** (*tuple*) – The parameter of the Gamma distribution that is used to sample each user's mu (activity level). This tuple should be of the form (shape, scale).
- **vocabulary** (*list*) – The list of available words to use when generating documents.
- **omega** (*float, default is 1*) – The decay parameter for the decay of the exponential decay kernel.
- **doc_length** (*int, default is 20*) – The maximum number of words per document.
- **doc_min_length** (*int, default is 5*) – The minimum number of words per document.
- **words_per_pattern** (*int, default is 10*) – The number of words that will have a non-zero probability to appear in each pattern.
- **random_state** (*int or RandomState object, default is None*) – The random number generator.

kernel(*t_i*, *t_j*)

Returns the kernel function for t_i and t_j.

Parameters

- **t_i** (*float*) – Timestamp representing *now*.
- **t_j** (*float*) – Timestamp representaing *past*.

Returns

Return type float

pattern_content_str(*patterns=None*, *show_words=-1*, *min_word_occurence=5*)

Return the content information for the patterns of the process.

Parameters

- **patterns** (*list, default is None*) – If this list is provided, only information about the patterns in the list will be returned.
- **show_words** (*int, default is -1*) – The maximum number of words to show for each pattern. Notice that the words are sorted according to their occurence count.
- **min_word_occurence** (*int, default is 5*) – Only show words that show up at least *min_word_occurence* number of times in the documents of the respective pattern.

Returns A string with all the content information

Return type str

plot(*num_samples=500*, *T_min=0*, *T_max=None*, *start_date=None*, *users=None*, *user_limit=50*, *patterns=None*, *task_detail=False*, *save_to_file=False*, *filename='user_timelines'*, *intensity_threshold=None*, *paper=True*, *colors=None*, *fig_width=20*, *fig_height_per_user=5*, *time_unit='months'*, *label_every=3*, *seed=None*)

Plots the intensity of a set of users for a set of patterns over a time period.

In this plot, each user is a separate subplot and for each user the plot shows her event_rate for each separate pattern that she has been active at.

Parameters

- **num_samples** (*int, default is 500*) – The granularity level of the intensity line. Smaller number of samples results in faster plotting, while larger numbers give much more detailed result.
- **T_min** (*float, default is 0*) – The minimum timestamp that the plot shows, in seconds.
- **T_max** (*float, default is None*) – If not None, this is the maximum timestamp that the plot considers, in seconds.
- **start_date** (*datetime, default is None*) – If provided, this is the actual datetime that corresponds to time 0. This is required if *paper* is True.
- **users** (*list, default is None*) – If provided, this list contains the id's of the users that will be plotted. Actually, only the first *user_limit* of them will be shown.
- **user_limit** (*int, default is 50*) – The maximum number of users to plot.
- **patterns** (*list, default is None*) – The list of patterns that will be shown in the final plot. If None, all of the patterns will be plotted.
- **task_detail** (*bool, default is False*) – If True, thee plot has one line per task. Otherwise, we only plot the commulative intensity of all tasks under the same pattern.
- **save_to_file** (*bool, default is False*) – If True, the plot will be saved to a *pdf* and a *png* file.
- **filename** (*str, default is 'user_timelines'*) – The name of the output file that will be used when saving the plot.

- **intensity_threshold** (*float, default is None*) – If provided, this is the maximum intensity value that will be plotted, i.e. the y_max that will be the cut-off threshold for the y-axis.
- **paper** (*bool, default is True*) – If True, the plot result will be the same as the figures that are in the published paper.
- **colors** (*list, default is None*) – A list of colors that will be used for the plot. Each color will correspond to a single pattern, and will be shared across all the users.
- **fig_width** (*int, default is 20*) – The width of the figure that will be returned.
- **fig_height_per_user** (*int, default is 5*) – The height of each separate user-plot of the final figure. If multiplied by the number of users, this determines the total height of the figure. Notice that due to a matplotlib constraint(?) the total height of the figure cannot be over 70.
- **time_unit** (*str, default is 'months'*) – Controls wether the time units is measured in days (in which case it should be set to 'days') or months.
- **label_every** (*int, default is 3*) – The frequency of the labels that show in the x-axis.
- **seed** (*int, default is None*) – A seed to the random number generator used to assign colors to patterns.

Returns **fig**

Return type matplotlib.Figure object

reset()

Removes all the events and users already sampled.

Note: It does not reseed the random number generator. It also retains the already sampled pattern parameters (word distributions and alphas)

---

sample_document(*pattern*)

Sample a random document from a specific pattern.

Parameters **pattern** (*int*) – The pattern from which to sample the content.

Returns A space separeted string that contains all the sampled words.

Return type str

sample_mu()

Samples a value from the prior of the base intensity mu.

Returns **mu_u** – The base intensity of a user, sampled from the prior.

Return type float

sample_next_time(*pattern*, *user*)

Samples the time of the next event of a pattern for a given user.

Parameters

- **pattern** (*int*) – The pattern index that we want to sample the next event for.
- **user** (*int*) – The index of the user that we want to sample for.

Returns **timestamp**

Return type float

sample_pattern_params()
Returns the word distributions for each pattern.

Returns **parameters** – A list of word distributions, one for each pattern.

Return type list

sample_pattern_popularity()
Returns a popularity distribution over the patterns.

Returns **pattern_popularities** – A list with the popularity distribution of each pattern.

Return type list

sample_time_kernels()
Returns the time decay parameter of each pattern.

Returns **alphas** – A list of time decay parameters, one for each pattern.

Return type list

sample_user_events(*min_num_events=100*, *max_num_events=None*, *t_max=None*)
Samples events for a user.

Parameters

- **min_num_events** (*int, default is 100*) – The minimum number of events to sample.
- **max_num_events** (*int, default is None*) – If not None, this is the maximum number of events to sample.
- **t_max** (*float, default is None*) – The time limit until which to sample events.

Returns **events** – A list of the form [(t_i, doc_i, user_i, meta_i), ...] sorted by increasing time that has all the events of the sampled users. Above, doc_i is the document and meta_i is any sort of metadata that we want for doc_i, e.g. question_id. The generator will return an empty list for meta_i.

Return type list

show_annotated_events(*user=None*, *patterns=None*, *show_time=True*, *T_min=0*, *T_max=None*)
Returns a string where each event is annotated with the inferred pattern.

Parameters

- **user** (*int, default is None*) – If given, the events returned are limited to the selected user
- **patterns** (*list, default is None*) – If not None, an event is return only if it belongs to one of the selected patterns
- **show_time** (*bool, default is True*) – Controls whether the time of the event will be shown
- **T_min** (*float, default is 0*) – Controls the minimum timestamp after which the events will be shown
- **T_max** (*float, default is None*) – If given, T_max controls the maximum timestamp shown

Returns

Return type str

show_pattern_content(*patterns=None*, *words=0*, *detail_threshold=5*)
Shows the content distrubution of the inferred patterns.

Parameters

- **patterns** (*list, default is None*) – If not None, only the content of the selected patterns will be shown
- **words** (*int, default is 0*) – A positive number that control how many words will be shown. The words are being shown sorted by their likelihood, starting with the most probable.
- **detail_threshold** (*int, default is 5*) – A positive number that sets the lower bound in the number of times that a word appeared in a pattern so that its count is shown.

Returns

Return type str

user_pattern_history_str(*user=None*, *patterns=None*, *show_time=True*, *t_min=0*)
Returns a representation of the history of a user's actions and the pattern that they correspond to.

Parameters

- **user** (*int, default is None*) – An index to the user we want to inspect. If None, the function runs over all the users.
- **patterns** (*list, default is None*) – If not None, limit the actions returned to the ones that belong in the provided patterns.
- **show_time** (*bool, default is True*) – Control wether the timestamp will appear in the representation or not.
- **t_min** (*float, default is 0*) – The timestamp after which we only consider actions.

Returns

Return type str

user_patterns(*user*)
Returns a list with the patterns that a user has adopted.

Parameters **user** (*int*) –

user_patterns_set(*user*)
Return the patterns that a specific user adopted.

Parameters **user** (*int*) – The index of a user.

Returns The set of the patterns that the user adopted.

Return type set

CHAPTER 3

The `Particle` object

class hdhp.**HDHProcess**(*num_patterns*, *alpha_0*, *mu_0*, *vocabulary*, *omega=1*, *doc_length=20*, *doc_min_length=5*, *words_per_pattern=10*, *random_state=None*)

__init__(*num_patterns*, *alpha_0*, *mu_0*, *vocabulary*, *omega=1*, *doc_length=20*, *doc_min_length=5*, *words_per_pattern=10*, *random_state=None*)

Parameters

- **num_patterns** (*int*) – The maximum number of patterns that will be shared across the users.
- **alpha_0** (*tuple*) – The parameter that is used when sampling the time kernel weights of each pattern. The distribution that is being used is a Gamma. This tuple should be of the form (shape, scale).
- **mu_0** (*tuple*) – The parameter of the Gamma distribution that is used to sample each user's mu (activity level). This tuple should be of the form (shape, scale).
- **vocabulary** (*list*) – The list of available words to use when generating documents.
- **omega** (*float, default is 1*) – The decay parameter for the decay of the exponential decay kernel.
- **doc_length** (*int, default is 20*) – The maximum number of words per document.
- **doc_min_length** (*int, default is 5*) – The minimum number of words per document.
- **words_per_pattern** (*int, default is 10*) – The number of words that will have a non-zero probability to appear in each pattern.
- **random_state** (*int or RandomState object, default is None*) – The random number generator.

kernel(*t_i*, *t_j*)

Returns the kernel function for t_i and t_j.

Parameters

- **t_i** (*float*) – Timestamp representing *now*.
- **t_j** (*float*) – Timestamp representaing *past*.

Returns

Return type float

pattern_content_str(*patterns=None*, *show_words=-1*, *min_word_occurence=5*)

Return the content information for the patterns of the process.

Parameters

- **patterns** (*list, default is None*) – If this list is provided, only information about the patterns in the list will be returned.
- **show_words** (*int, default is -1*) – The maximum number of words to show for each pattern. Notice that the words are sorted according to their occurence count.
- **min_word_occurence** (*int, default is 5*) – Only show words that show up at least *min_word_occurence* number of times in the documents of the respective pattern.

Returns A string with all the content information

Return type str

plot(*num_samples=500*, *T_min=0*, *T_max=None*, *start_date=None*, *users=None*, *user_limit=50*, *patterns=None*, *task_detail=False*, *save_to_file=False*, *filename='user_timelines'*, *intensity_threshold=None*, *paper=True*, *colors=None*, *fig_width=20*, *fig_height_per_user=5*, *time_unit='months'*, *label_every=3*, *seed=None*)

Plots the intensity of a set of users for a set of patterns over a time period.

In this plot, each user is a separate subplot and for each user the plot shows her event_rate for each separate pattern that she has been active at.

Parameters

- **num_samples** (*int, default is 500*) – The granularity level of the intensity line. Smaller number of samples results in faster plotting, while larger numbers give much more detailed result.
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Parameters

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- **patterns** (*list, default is None*) – If not None, an event is return only if it belongs to one of the selected patterns
- **show_time** (*bool, default is True*) – Controls whether the time of the event will be shown
- **T_min** (*float, default is 0*) – Controls the minimum timestamp after which the events will be shown
- **T_max** (*float, default is None*) – If given, T_max controls the maximum timestamp shown

Returns

Return type str

show_pattern_content(*patterns=None*, *words=0*, *detail_threshold=5*)
Shows the content distrubution of the inferred patterns.

Parameters

- **patterns** (*list, default is None*) – If not None, only the content of the selected patterns will be shown
- **words** (*int, default is 0*) – A positive number that control how many words will be shown. The words are being shown sorted by their likelihood, starting with the most probable.
- **detail_threshold** (*int, default is 5*) – A positive number that sets the lower bound in the number of times that a word appeared in a pattern so that its count is shown.

Returns

Return type str

user_pattern_history_str(*user=None*, *patterns=None*, *show_time=True*, *t_min=0*)
Returns a representation of the history of a user's actions and the pattern that they correspond to.

Parameters

- **user** (*int, default is None*) – An index to the user we want to inspect. If None, the function runs over all the users.
- **patterns** (*list, default is None*) – If not None, limit the actions returned to the ones that belong in the provided patterns.
- **show_time** (*bool, default is True*) – Control wether the timestamp will appear in the representation or not.
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Return type str

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Return type set

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