
Section alignment image suggestions

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Recommend images for Wikipedia article sections based on equivalent section titles across Wikipedia language editions.

GET READY

You need [access](#) to a Wikimedia Foundation's [analytics client](#), AKA a *stat box*. Then:

```
me@my_box:~$ ssh stat1008.eqiad.wmnet # Or pick another one
me@stat1008:~$ export http_proxy=http://webproxy.eqiad.wmnet:8080
me@stat1008:~$ export https_proxy=http://webproxy.eqiad.wmnet:8080
me@stat1008:~$ git clone https://gitlab.wikimedia.org/repos/structured-data/section-
↪image-recs.git sir
me@stat1008:~$ conda-analytics-clone MY_ENV
me@stat1008:~$ source conda-analytics-activate MY_ENV
(MY_ENV) me@stat1008:~$ conda install -c conda-forge pandas=1.5.3
(MY_ENV) me@stat1008:~$ pip install mwparserfromhell==0.6.4
(MY_ENV) me@stat1008:~$ cd sir
```


GET SET: EXTRACT AVAILABLE IMAGES

```
(MY_ENV) me@stat1008:~/sir$ python imagerec/article_images.py --wikitext-snapshot YYYY-  
↪MM --item-page-link-snapshot YYYY-MM-DD --output article_images
```

2.1 –help me

```
(MY_ENV) me@stat1008:~/sir$ python imagerec/article_images.py --help  
usage: article_images.py [-h] --wikitext-snapshot YYYY-MM --item-page-link-snapshot  
      YYYY-MM-DD --output /hdfs_path/to/parquet  
      [--wp-codes-file /path/to/file.json | --wp-codes [wp-code ...]]
```

Gather images available in Wikipedia articles from wikitext

options:

```
-h, --help          show this help message and exit  
--wikitext-snapshot YYYY-MM  
                    "wmf.mediawiki_wikitext_current" Hive monthly snapshot  
--item-page-link-snapshot YYYY-MM-DD  
                    "wmf.wikidata_item_page_link" Hive weekly snapshot  
--output /hdfs_path/to/parquet  
                    HDFS path to output parquet  
--wp-codes-file /path/to/file.json  
                    path to JSON file with a list of Wikipedia language codes to  
                    process. Default: all Wikipedias, see "data/wikipedia.json"  
--wp-codes [wp-code ...]  
                    space-separated Wikipedia language codes to process. Example:  
                    ar en zh-yue
```


GO: GENERATE SUGGESTIONS

```
(MY_ENV) me@stat1008:~/sir$ python imagerec/recommendation.py --section-images article_
→ images --section-alignments /user/mnz/secmap_results/aligned_sections_subset/aligned_
→ sections_subset_9.0_2022-02.parquet --max-target-images 0 --output suggestions
```

3.1 Get –help!

```
(MY_ENV) me@stat1008:~/sir$ python imagerec/recommendation --help
usage: recommendation.py [-h] --section-images /hdfs_path/to/parquet
                        --section-alignments /hdfs_path/to/parquet
                        --max-target-images N --output /hdfs_path/to/parquet
                        [--wp-codes-file /path/to/file.json | --wp-codes [wp-code ...]]
                        [-t /hdfs_path/to/parquet] [--keep-lists-and-tables]
```

Generate section-level image suggestions based on section alignments

options:

```
-h, --help                show this help message and exit
--section-images /hdfs_path/to/parquet
                        HDFS path to parquet of section images, as output by
                        "article_images.py"
--section-alignments /hdfs_path/to/parquet
                        HDFS path to parquet of section alignments
--max-target-images N
                        Maximum number of images that a section being recommended
                        images should contain. Use 0 if you want to generate
                        recommendations only for unillustrated sections.
--output /hdfs_path/to/parquet
                        HDFS path to output parquet
--wp-codes-file /path/to/file.json
                        path to JSON file with a list of Wikipedia language codes to
                        process. Default: all Wikipedias, see "data/wikipedia.json"
--wp-codes [wp-code ...]
                        space-separated Wikipedia language codes to process. Example:
                        ar en zh-yue
-t /hdfs_path/to/parquet, --table-filter /hdfs_path/to/parquet
                        HDFS path to parquet with a dataframe to exclude, as output by
                        "https://gitlab.wikimedia.org/repos/structured-data/section-
                        topics/-/blob/main/scripts/detect_html_tables.py". The
```

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```
dataframe must include dict_keys(['wiki_db', 'page_id',  
'section_title']) columns. Default: ar, bn, cs, es, id, pt, ru  
sections with tables, see "20230301_target_wikis_tables" in  
the current user home  
--keep-lists-and-tables  
don't skip sections with at least one standard wikitext list  
or table
```

TRIGGER AN AIRFLOW TEST RUN

Follow this walkthrough to simulate a production execution of the pipeline on your stat box. Inspired by [this snippet](#).

4.1 Build your artifact

1. Pick a branch you want to test from the drop-down menu
2. Click on the pipeline status button, it should be a green tick
3. Click on the *play* button next to `publish_conda_env`, wait until done
4. On the left sidebar, go to **Packages and registries > Package Registry**
5. Click on the first item in the list, then copy the Asset URL. It should be something like `https://gitlab.wikimedia.org/repos/structured-data/section-image-recs/-/package_files/1322/download`

4.2 Get your artifact ready

```
me@stat1008:~$ mkdir artifacts
me@stat1008:~$ cd artifacts
me@stat1008:~$ wget -O MY_ARTIFACT MY_COPIED_ASSET_URL
me@stat1008:~$ hdfs dfs -mkdir artifacts
me@stat1008:~$ hdfs dfs -copyFromLocal MY_ARTIFACT artifacts
me@stat1008:~$ hdfs dfs -chmod -R o+rx artifacts
```

4.3 Spin up an Airflow instance

On your stat box:

```
me@stat1008:~$ git clone https://gitlab.wikimedia.org/repos/data-engineering/airflow-
↪dags.git
me@stat1008:~$ cd airflow-dags
me@stat1008:~$ rm -r /tmp/MY_AIRFLOW_HOME # If you've previously run the next command
me@stat1008:~$ sudo -u analytics-privatedata ./run_dev_instance.sh -m /tmp/MY_AIRFLOW_
↪HOME -p MY_PORT platform_eng
```

On your local box:

```
me@my_box:~$ ssh -t -N stat1008.eqiad.wmnet -L MY_PORT:stat1008.eqiad.wmnet:MY_PORT
```

4.4 Trigger the DAG run

1. Go to `http://localhost:MY_PORT/` on your browser
2. On the top bar, go to **Admin > Variables**
3. Click on the middle button (*Edit record*) next to the `platform_eng/dags/section_alignment_image_suggestions_dag.py` Key
4. Update `{ "conda_env" : "hdfs://analytics-hadoop/user/ME/artifacts/MY_ARTIFACT" }`
5. Add any other relevant DAG properties
6. Click on the *Save* button
7. On the top bar, go to **DAGs** and click on the `section_alignment_image_suggestions` slider. This should trigger an automatic DAG run
8. Click on `section_alignment_image_suggestions`

You're all set!

RELEASE

1. On the left sidebar, go to **CI/CD > Pipelines**
2. Click on the *play* button, select `trigger_release`
3. If the job went fine, you'll find a new artifact in the [Package Registry](#)

We follow Data Engineering's [workflow_utils](#): - the main branch is on a `.dev` release - releases are made by removing the `.dev` suffix and committing a tag

DEPLOY

1. On the left sidebar, go to **CI/CD > Pipelines**
2. Click on the *play* button and select `bump_on_airflow_dags`. This will create a merge request at [airflow-dags](#)
3. Double-check it and merge
4. Deploy the DAGs:

```
me@my_box:~$ ssh deployment.eqiad.wmnet
me@deploy1002:~$ cd /srv/deployment/airflow-dags/platform_eng/
me@deploy1002:~$ git pull
me@deploy1002:~$ scap deploy
```

See the [docs](#) for more details.

API DOCUMENTATION

7.1 Extract available images

This is the first task of the section alignment image suggestions data pipeline: to extract images available in Wikipedia article sections.

Inputs come from Wikimedia Foundation's [Analytics Data Lake](#):

- [Wikipedias wikitext](#) (all Wikipedias by default as per [wikipedias.json](#))
- [Wikidata item page links](#)

High-level steps:

- look up Wikidata [QIDs](#) from article page IDs
- gather image file names from sections (lead one excluded) via the [MediaWiki parser from hell](#)
- filter out sections with standard lists and tables, which typically don't convey relevant content

Output `pyspark.sql.DataFrame` row example:

item_id	page_id	page_title	article_images	wiki_db
Q5861764	1248254	Fi-esta_del_Gran_Poder	[[1, Descripción, [La_Paz_Bolivia_Tata_Danzante.jpg, ...]], ...]	eswiki

More [documentation](#) lives in MediaWiki.

class `imagerec.article_images.SectionImages`(*index*, *heading*, *images*)

`dataclasses.dataclass()` that stores image file names available in a Wikipedia article section.

Parameters

- **index** (`int`) – a section numerical index
- **heading** (`str`) – a section heading
- **images** (`List[str]`) – a list of image file names

`imagerec.article_images.wikitext_headings_to_anchors`(*headings*)

Same as `section_topics.pipeline.wikitext_headings_to_anchors()`.

Return type

`List[str]`

`imagerec.article_images.get_images(wikitext)`

Grab all image file names from a wikitext.

Parameters

wikitext (`str`) – a wikitext

Return type

`List[str]`

Returns

the list of image file names

`imagerec.article_images.extract_section_images(wikitext)`

Parse a wikitext into section indices, titles, and images. The lead section is excluded.

Note: This is the core function responsible for the data heavy lifting. It's implemented as a PySpark user-defined function (`pyspark.sql.functions.udf()`).

Parameters

wikitext (`str`) – a wikitext

Return type

`Optional[List[SectionImages]]`

Returns

the list of *SectionImages*

`imagerec.article_images.get_article_images(spark, wikitext_snapshot, item_page_link_snapshot, wiki_dbs)`

Extract images available in Wikipedia article sections.

Parameters

- **spark** (`SparkSession`) – an active Spark session
- **wikitext_snapshot** (`str`) – a YYYY-MM date
- **item_page_link_snapshot** (`str`) – a YYYY-MM-DD date
- **wiki_dbs** (`Optional[List[str]]`) – a list of wikis to process. Pass `None` for all wikis

Return type

`DataFrame`

Returns

the dataframe of section images

7.2 Generate suggestions

This is the second task of the section alignment image suggestions data pipeline: to generate image suggestions for Wikipedia article sections.

Inputs:

- Wikipedia article section images as output by *Extract available images*
- machine-learned *section alignment* dataset of (*source*, *target*) section title pairs

High-level steps given a target section:

- skip it if it has more images than a threshold
- gather all equivalent source pages with the same Wikidata [QID](#) as the target page
- filter out irrelevant images from the source sections, namely icons or those appearing in the target too
- project all source section images to the target
- combine suggestion candidates

Output `pyspark.sql.DataFrame` row example:

target_id	target_heading	item_id	target_title	target_index	recommended_images	target_wiki_db
1485753	Biografia	Q31747	Ali_Shariati	1	[[frwiki -> [Shariati7.jpg]], {ruwiki -> [Shariati7.jpg]}, ...]	ptwiki

More [documentation](#) lives in MediaWiki.

class `imagerec.recommendation.Page`(*item_id*, *page_id*, *page_title*, *wiki_db*, *section_images*)
`dataclasses.dataclass()` that stores a Wikipedia article page and its available images.

Parameters

- **item_id** (`str`) – a page Wikidata QID
- **page_id** (`int`) – a page ID
- **page_title** (`str`) – a page title
- **wiki_db** (`str`) – a page wiki
- **section_images** (`List[SectionImages]`) – a list of section images

class `imagerec.recommendation.Recommendation`(*item_id*, *target_id*, *target_title*, *target_index*,
target_heading, *target_wiki_db*, *source_heading*,
source_wiki_db, *recommended_images*)
`dataclasses.dataclass()` that stores image suggestions for a target Wikipedia article page.

Parameters

- **item_id** (`str`) – a page Wikidata QID
- **target_id** (`int`) – a page ID
- **target_title** (`str`) – a page title
- **target_index** (`int`) – a section numerical index
- **target_heading** (`str`) – a section heading
- **target_wiki_db** (`str`) – a page wiki
- **source_heading** (`str`) – a section heading where suggestions come from
- **source_wiki_db** (`str`) – a page wiki where suggestions come from
- **recommended_images** (`List[str]`) – a list of suggested image file names

`imagerec.recommendation.load(article_images)`

Convert section images from an *Extract available images*'s output row to a `imagerec.article_images.SectionImages` instance.

Parameters

article_images (`str`) – a stringified JSON array of section images. Corresponds to a value of the `article_images` column in *Extract available images*'s output `pyspark.sql.DataFrame`

Return type

`List[SectionImages]`

Returns

the list of converted section images

`imagerec.recommendation.rows_to_pages(df)`

Convert all input `pandas.DataFrame` rows to *Page* instances.

Parameters

df (`DataFrame`) – an in-memory dataframe loaded from *Extract available images*'s output `pyspark.sql.DataFrame`

Return type

`List[Page]`

Returns

the list of pages

`imagerec.recommendation.filter_source_images(source_images, target_images)`

Filter out source images that either appear in target ones or are icons/indicators.

Icon and indicator file names have a `00js_UI_icon` and `00js_UI_indicator` prefix respectively.

Parameters

- **source_images** (`Sequence[str]`) – a sequence of source image file names
- **target_images** (`Set[str]`) – a set of target image file names

Return type

`List[str]`

Returns

the list of filtered source image file names

`imagerec.recommendation.make_recommendations(target_page, source_page, max_target_images)`

Generate all image suggestion candidates for a target page via the *Cartesian product* of all (*target*, *source*) section pairs.

Filter source images through `filter_source_images()`. Filter target sections with more images than a given threshold.

Parameters

- **target_page** (*Page*) – a target page
- **source_page** (*Page*) – a source page
- **max_target_images** (`int`) – a maximum amount of images for a target section to be kept

Return type

`List[Recommendation]`

Returns

the list of image suggestion candidates

`imagerec.recommendation.combine_pages(target_pages, source_pages)`

Generate all *(target, source)* page pairs via their Cartesian product.

Ensure that no pair has the same language.

Parameters

- **target_pages** (`Sequence[Page]`) – a sequence of target pages
- **source_pages** (`Sequence[Page]`) – a sequence of source pages

Return type

`List[Tuple[Page, Page]]`

Returns

the list of *(target, source)* page pairs

`imagerec.recommendation.generate_image_recommendations(target_wiki_dbs, max_target_images, df)`

Generate all possible suggestions for pages in the target wikis.

Filter out empty ones.

Parameters

- **target_wiki_dbs** (`Sequence[str]`) – a sequence of target wikis
- **max_target_images** (`int`) – a maximum amount of images for a target section to be kept
- **df** (`DataFrame`) – an in-memory dataframe of pages

Return type

`DataFrame`

Returns

the in-memory dataframe of image suggestions

`imagerec.recommendation.get_image_recommendations(section_images_df, target_wiki_dbs, max_target_images)`

Generate the full dataset of all possible suggestions for all sections of all pages in the target wikis.

Corresponding source pages have the same Wikidata QID as a given target page.

Parameters

- **section_images_df** (`DataFrame`) – a distributed dataframe of section images
- **target_wiki_dbs** (`Sequence[str]`) – a sequence of target wikis
- **max_target_images** (`int`) – a maximum amount of images for a target section to be kept

Return type

`DataFrame`

Returns

the distributed dataframe of image suggestions

`imagerec.recommendation.normalize_heading_column(column, substitute_pattern='[\\s_]', strip_chars='!\"#$%&\\' *+, -./:;<=>?@[\\]^_`{|}~')`

Same as `section_topics.pipeline.normalize_heading_column()`.

Return type

`Column`

`imagerec.recommendation.process_image_recommendations(recommendations_df, alignments_df)`

Build the final output dataset of image suggestions.

Combine all suggestion candidates with aligned sections.

Parameters

- **recommendations_df** (DataFrame) – a distributed dataframe of all image suggestion candidates
- **alignments_df** (DataFrame) – a distributed dataframe of section alignments

Return type

DataFrame

Returns

the distributed dataframe of final image suggestions

`imagerec.recommendation.apply_filter(df, filter_df, broadcast=False)`

Same as `section_topics.pipeline.apply_filter()`.

Return type

DataFrame

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