DE BIAS

Detecting and Cur(at)ing Harmful Language in Cultural Heritage Collections

Worldwide wall - Associazione Culturale GoTellGo, Italy - CC BY





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The DE-BIAS Tool

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General aspects

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Revelations, spectacle du Alvin Ailey city center theater. Festival d'Avignon 1977. By Fernand Michaud, 1992 - National Library of France -No Copyright - Other Known Legal Restrictions



Processing steps

Tokenization \rightarrow The plain text is split into words, phrases or other meaningful elements for analysis.

Lemmatization \rightarrow The lemma of a word is identified. This enables matching a word from the vocabulary to a word in the analysed text, including different inflections.

NER = Named Entity Recognition \rightarrow A word's context and positioning within the text is used to determine whether a term qualifies as a proper noun (e.g. a person's name or a place name), which may then be excluded from the tagging process.

LLM = Large Language Model \rightarrow Used to determine whether a term that can be contentious in one context, but appropriate in another is to be flagged.



The DE-BIAS Tool

- **Applies the DE-BIAS vocabulary** with contextual information and alternatives as a foundation.
- Works language-specific → Potential errors may occur if metadata is not labeled or mislabeled.
- Applies lemmatization → Words are reduced to their base or root form so that different forms of the same word are recognised.
- Can detect whether a problematic term is part of a proper name via **Named Entity Recognition**.
- Partially recognises ambiguous terms (e.g., "exotic", "dwarf") by applying the contentious issue descriptions of the vocabulary and exploiting Large Language Models.



The tool's output

Detection and contextualisation

- The tool identifies potentially problematic language used in the metadata of heritage collections
- It enables the highlighting of such language by annotating the analysed metadata
 - Marks the contentious term, the metadata field it was found in, and its specific position within the text (helpful especially with longer descriptive data)
 - Makes the original context of words understandable to users and suggests (if applicable) possible alternatives



Example 1 - Terms detected in text

Indianerkapelle, Markgraf Christian von Brandenburg als Indianer, begleitet von Herolden. 4. Part, Blatt 16 aus: Abriß und Verzeichnis aller Inventionen und Aufzüge, welche an Fastnachten Anno 1609 im kurfürstl. Schlosse zu Dresden aufgeführt wurden. Deckfarben; ca. 289 x 527 mm. Dresden: SLUB Mscr.Dresd.J.18

(from https://www.europeana.eu/en/item/188/item 4NA4VY56ATII67YP2RLNT5WQN2SZIVGC)

The terms "Indianerkapelle" and "Indianer" were flagged by the tool as contentious.

Example 2 - Detection rejected by NER

The <u>Queer Liberation March</u> is an annual LGBTQAI+ protest march in Manhattan, organised by the Reclaim Pride Coalition as an anti-corporate alternative to the NYC Pride March.

The term "Queer" was detected in the text, but because the term is part of the "Queer Liberation March" named entity, it was not flagged as contentious.

Example 3 - Disambiguation with the context-aware module (LLM)

Prompt: The term queer can have a contentious meaning when used in some contexts. It is contentious when used in a derogatory manner to refer to a person's sexuality but not when used as an umbrella term for sexual interests and identities that challenge social norms for sexual behaviour.

Is the term used in a contentious manner in the following text, yes or no?

Queer studies are not the same as queer theory, which is an analytical viewpoint within queer studies (centered on literary studies and philosophy) that challenges the existence of "socially constructed" categories of sexual identity.

Example 3 - Disambiguation with the context-aware module (LLM)

Response:

No

Because the term queer has both a contentious and a non-contentious context, we use an LLM guided by the information provided by the vocabulary (in the prompt) to detect whether the use of the term in the provided text (red) is derogatory or not. In this example, the term is used when talking about different academic research areas.



Some more technical background

- Combination of the NLP tools provided by the <u>Stanford Stanza</u> Python library and a locally deployed LLM
 - Pipeline of various Natural Language Processing (NLP) tools, models, and algorithms, including tokenization, multi-word token (MWT) expansion, lemmatization, part-of-speech (POS) and morphological features tagging, dependency parsing, and NER
 - Covers all five of the DE-BIAS project languages with high performance levels of 95% accuracy and above (based on a variety of research data sets used for training)
- Adaptations specific for DE-BIAS, e.g. inclusion of compound words



Some more technical background

- For the LLM, DE-BIAS decided for the application of an Autoregressive LLM (AR LLM)
 - Allowing for some form of "creativity" in analysing texts
 - Better in "understanding" language, producing text that respects common facts about the world and contextual meaning
 - Have shown increased knowledge acquisition capabilities and have been used successfully for tasks other than text generation without having to adapt them
- Tested various models from the <u>Mistral AI</u> and <u>Stable LM</u> families
 - Decided for the Mixtral 8x7b Instruct Q3_K_L based on our quality requirements and available computing capacities



Availability of the tool



DE-BIAS Platform

https://debias-tool.ails.ece.ntua.gr/





Use cases for the tool

- Web interface: fast checking of values
- **Data upload**: bulk checking of values
- **Custom API integration**: repeated checking of large amounts of data

Documentation

https://pro.europeana.eu/files/Europeana Professional/Projects/debias/DE-BI AS D3.2 ReportOnTheFunctionalityOfTheTool.pdf

The standalone version

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Option 1: Insert texts



The DE-BIAS tool detects and contextualises harmful language in cultural heritage collections. Developed as part of the DE-BIAS project, the tool helps cultural heritage professionals to identify and address bias in their collections.

| e * | | | | |
|--------------------------|---|---|---|---|
| language of th | ne data you are u | ploading. | | |
| า | | | | |
| NER Filter out detect | ions that are part o | f named entities | | |
| Use context to (| decide whether det | ected terms are cont | entious | |
| | e * language of th h NS NER Filter out detect Disambiguatio Use context to o | e * I language of the data you are u h NS NER Filter out detections that are part o Disambiguation Use context to decide whether det | e * tanguage of the data you are uploading. h NS NER Filter out detections that are part of named entities Disambiguation Use context to decide whether detected terms are cont | e * a language of the data you are uploading. h NS NER Filter out detections that are part of named entities Disambiguation Use context to decide whether detected terms are contentious |

- Select the language of your text (Dutch, English, French, German, Italian)
- Decide whether to apply Named Entity Recognition and/or Disambiguation
- Enter your text (type or copy & paste)
- Add one or several texts and have them analysed together



Example analysis of several texts in English

| | Select the language of the data you are uploading. |
|---|--|
| | English |
| 2 | Operations |
| | NER NER |
| | Filter out detections that are part of named entities |
| | Disambiguation |
| | Use context to decide whether detected terms are contentious |
| | Enter text * |
| | Fur-lined yellow silk tapestry (kesi) dragon robe made in China between 1820 and 1850. Clothing was carefully regulated at the Qing court, with colour and decoration used to indicate rank. Brigh yellow robes were reserved for the emperor, empress dowager, empress and first-rank concubine. The heir apparent and his wife |
| | Rugby The Netherlands-South Africa SERIES TITLE: Open Images |
| | |
| | A colored South African team wins the rugby match against the |

Week number 25-39 Newsreels in which Dutch subjects of a certain week are presented.

What does the result look like?

Analysis Report

Fur-lined yellow silk tapestry (kesi) dragon robe made in China between 1820 and 1850. Clothing was carefully regulated at the Qing court, with colour and decoration used to indicate rank. Bright yellow robes were reserved for the emperor, empress dowager, empress and first-rank concubine. The heir apparent and his wife wore apricot-colour robes, and the emperor's other sons wore golden yellow. There were also rules dictating the correct clothing for each season and when these seasonal wardrobe changes should be made. Summer robes were often made from fine silk gauze while winter robes could be padded or fur-lined.

1 found

2

1

Rugby The Netherlands-South Africa SERIES TITLE: Open Images A coloured South African team wins the rugby match against the Dutch Impalas in Hilversum with 28-23. With the Dutch coach Van Reenen and the South African Isaacs.

1 found

3

Giant Albert with his dwarf Week number 25-39 Newsreels in which Dutch subjects of a certain week are presented.

1 found

- Detected terms are highlighted
- Highlights link to the term in the DE-BIAS Vocabulary from where all further information can be accessed:
 - Contentious issue description
 - Alternative terms
 - Suggestions on language to use instead
 - Etc.

Option 2: Upload a file

| _anguage * | | |
|---|--|--|
| Select the language of th | e data vou are u | ploading. |
| English | | |
| Operations | | |
| NER | | |
| Filter out detecti | ons that are part o | f named entities |
| Disambiguation | n | |
| Use context to d | ecide whether det | anted terms are contentious |
| | | ected terms are contentious |
| Jpload .zip file * | | ected terms are contentious |
| Upload .zip file * The .zip file should conta files should be encoded i | in text files (.txt) n UTF-8. | with the data you want to analyze. The text |
| Upload .zip file * The .zip file should conta files should be encoded i Oupload .zip | in text files (.txt) n UTF-8. N.zip | with the data you want to analyze. The text |
| Upload .zip file * The .zip file should conta files should be encoded i Upload .zip Provide an email addr | in text files (.txt) n UTF-8. N.zip ess * | with the data you want to analyze. The text |
| Upload .zip file * The .zip file should conta files should be encoded i Upload .zip E Provide an email addr When the results are read report. Please also check | in text files (.txt) n UTF-8. N.zip 💼 ess * dy, you will recei | with the data you want to analyze. The text ve an email at this email address with the er. |

- Select the language of your text (Dutch, English, French, German, Italian)
- Decide whether to apply Named Entity Recognition and/or Disambiguation
- Attach ZIP file with the files to be analysed (stick with .txt files; make sure, their encoding is UTF-8)
- Add your email address



What does the result look like?

Your files have been submitted!

When the results are ready, you will receive an email with the analysis report at . Please also check your spam folder.

New Analysis

- Email with summary report in PDF and annotations of detected bias terms in JSON
- The JSON file includes the URI of the detected terms in the DE-BIAS Vocabulary, via which more information can be retrieved
- It will also indicates where in the text a term has been detected (start character, end character, length)



How to prepare data for upload

- Each record should be stored in a separate .txt file
 - The tool will treat each .txt file as one value to be analysed
 - To each value, the tool will the associate the annotations for detected biassed terms and reference the file name in the output
- All .txt files to be analysed even if it is only one need to be provided to the tool in .zip format
- Since the **language of the metadata is selected once per analysis for all records**, a .zip file should only contain records with metadata in one language
 - Prepare separate .zip files if you wish to analyse metadata in different languages



The DE-BIAS Tool in the Metis Sandbox

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Revelations, spectacle du Alvin Ailey city center theater. Festival d'Avignon 1977. By Fernand Michaud, 1992 - National Library of France -No Copyright - Other Known Legal Restrictions

Preparing data for Europeana.eu

- Upload a dataset to the Metis Sandbox for data quality and other checks
- Follow the usual processing steps
- Once the dataset has been processed, the option to "Run report DE-BIAS" becomes available

Dataset Processing

Test 🗸

United Kingdom / English 11/12/2024, 01:20:40





What does the result look like?

| Ģ | В <mark>віаș</mark> Dataset 5 | 139 - Debias Report (15) | | | | | | | |
|---|--|---|--|--|--|--|--|--|--|
| 0 | Europeana Id: | /5139/item_08602_IL5000029543 IZ | | | | | | | |
| Ŭ | Field: | dc:description | | | | | | | |
| | Language: | en (English) | | | | | | | |
| | 3 - the rag giraffe chases a dwarf ⊠ dressed in the Turkish | | | | | | | | |
| | Europeana Id: | /5139/item_2048015_Athena_Plus_ProvidedCHO_Biblioteca _Academiei_Rom_ne_DocIstCCCLVII_20 ビ dc:title | | | | | | | |
| | Field: | | | | | | | | |
| | Language: | en (English) | | | | | | | |
| | Literal: | Sturdza, the hatman and the lever of Suceava, makes Eremia, a former speaker, inscribed on the gypsy 🖄 robes he Close | | | | | | | |

- "Run report" changes to "View report" once done → click to open the report in a pop-up
- Detected term is highlighter in context ("literal") and includes the record ID, the metadata field where the term was found and the language used for analysing
- Highlights link to the term in the DE-BIAS Vocabulary from where all further information can be accessed
- Download option in CSV



CSV download of the analysis report

| dataset-id | creation-date | detection_recordId | detection_europeanald | detection_sourceField | Detection_language | Detection_literal | _tags_start | _tags_end | _tags_length | detection_valueDetection_tags_uri |
|------------|---------------|--------------------|------------------------|-----------------------|--------------------|--|-------------|-----------|--------------|-----------------------------------|
| | | | | | | | | | | |
| 5139 | 2024-12-11T00 | 242505 | /5139/item_2022362R | DC_TITLE | en | ?Negroes at Scho | 1 | 8 | 7 | debias:t_165_en |
| | | 242507 | /5139/item_08602_IL500 | DC_DESCRIPTION | en | 3 - the rag giraffe | 29 | 34 | 5 | debias:t_76_en |
| | | 242508 | /5139/item_2048015_Ath | DC_TITLE | en | Sturdza, the hatm | 95 | 100 | 5 | debias:t_99_en |
| | | 242501 | /5139/item_08602_IL500 | DC_DESCRIPTION | en | 2 - the visiting tea | 61 | 72 | 11 | debias:t_171_en |
| | | 242501 | /5139/item_08602_IL500 | DC_DESCRIPTION | en | 3 - then the team | 45 | 56 | 11 | debias:t_171_en |
| | | 242501 | /5139/item_08602_IL500 | DC_DESCRIPTION | en | Rome: Undersecr | 84 | 92 | 8 | debias:t_128_en |
| | | 242507 | /5139/item_08602_IL500 | DC_DESCRIPTION | it | 3 - la giraffa di pe | 35 | 39 | 4 | debias:t_18_it |
| | | 242509 | /5139/item_2064121_Mu | DC_DESCRIPTION | de | Dieses Blatt gehö Auf diesem Blatt Beschriftung: Pla | 105 | 110 | 5 | debias:t_153_de |
| | | 242504 | /5139/item_440_item_HX | DC_TITLE | de | Zigeunerin, einer | 0 | 10 | 10 | debias:t_32_de |
| | | 242503 | /5139/item_2048221_eur | DC_TITLE | en | Women of the Bo | 18 | 23 | 5 | debias:t_208_en |
| | | 242509 | /5139/item_2064121_Mu | DC_SUBJECT_REFEREN | l en | Prostitution | 0 | 12 | 12 | debias:t_180_en |
| | | 242500 | /5139/item_08602_IL500 | DC_DESCRIPTION | en | 15 - ella crosses t | 57 | 62 | 5 | debias:t_165_en |
| | | 242506 | /5139/item_2048221_eur | DC_TITLE | en | Costume design | 0 | 7 | 7 | debias:t_53_en |
| | | | | | | | 19 | 25 | 6 | debias:t_212_en |
| | | 242504 | /5139/item_440_item_HX | DC_TITLE | en | Gypsy woman, tr | 0 | 5 | 5 | debias:t_99_en |
| | | 242500 | /5139/item_08602_IL500 | DC_DESCRIPTION | it | 15 - ella attravers | 60 | 65 | 5 | debias:t_7_it |

5139_debias_report



How to prepare data for upload

- Use the established workflow and guidelines for ingesting records into the Metis Sandbox
 - See <u>https://europeana.atlassian.net/wiki/spaces/EF/pages/2104295432/</u> <u>Metis+Sandbox+User+Guide#3-How-to-prepare-your-dataset</u>
- Make sure that any literal values in the metadata elements *dc:title*, *dcterms:alternative*, *dc:description*, *dc:subject*, *dc:type* and *skos:prefLabel* are accompanied by an *xml:lang* attribute in these elements
- Please note that only elements with the following language attributions can be analysed by the tool at the moment: en, nl, it, fr, de





DE BIAS

Website pro.europeana.eu/project/de-bias

Contact project.debias@gmail.com

Follow us on social media using the hashtag #DeBias

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The Chinese Market, François Boucher, 1742 - Rijksmuseum, The Netherlands - Public Domain