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A Tutorial on Wikimedia Visual Resources and its Application to Neural Visual Recommender Systems

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WIKIMEDIA
FOUNDATION



2001-2021

All Wikis



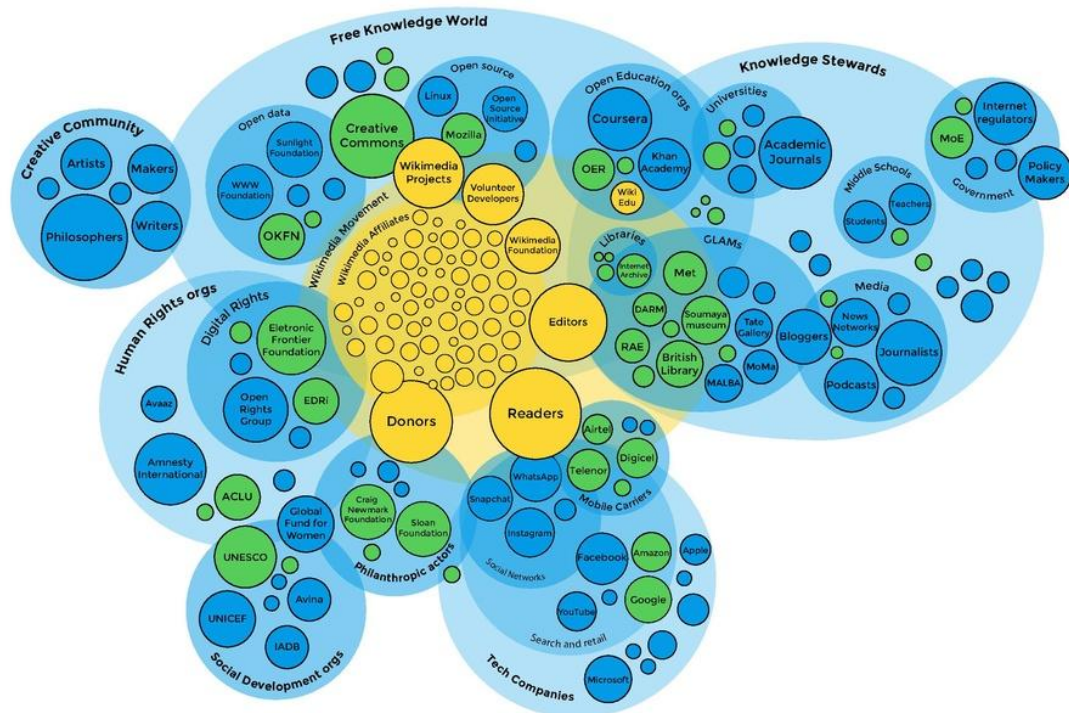
55+ million
articles

36+ million
edit/month

19+ billion
pageviews/month

Wikimedia Foundation

- Non-profit organization
- Operates Wikipedia and sister projects
- ~500 employees
 - **Research team**
have only 8 people!

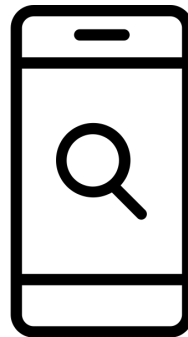


Minimalist user data collection

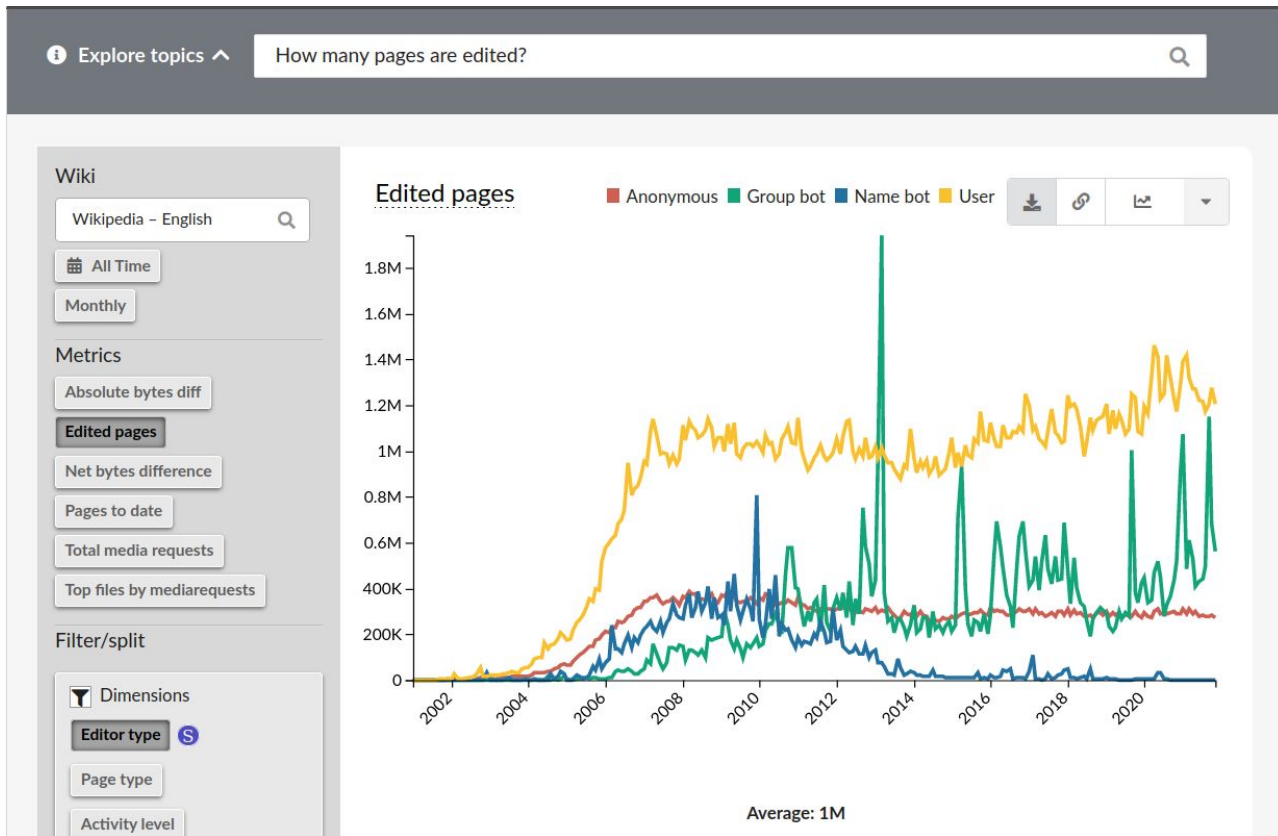
Revision histories are public data

No 3rd-party collection or sharing of user data

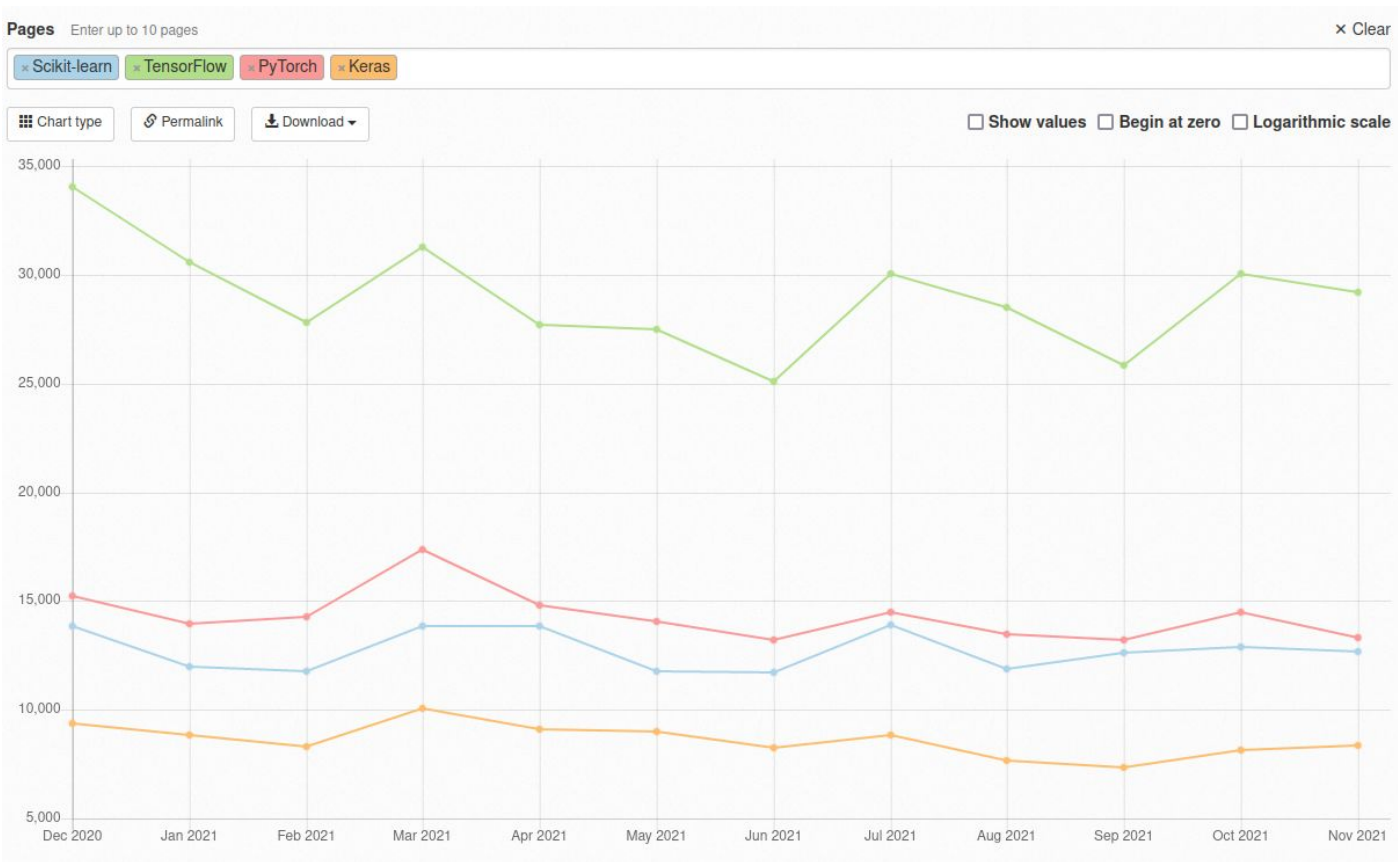
Private user data removed after 90 days



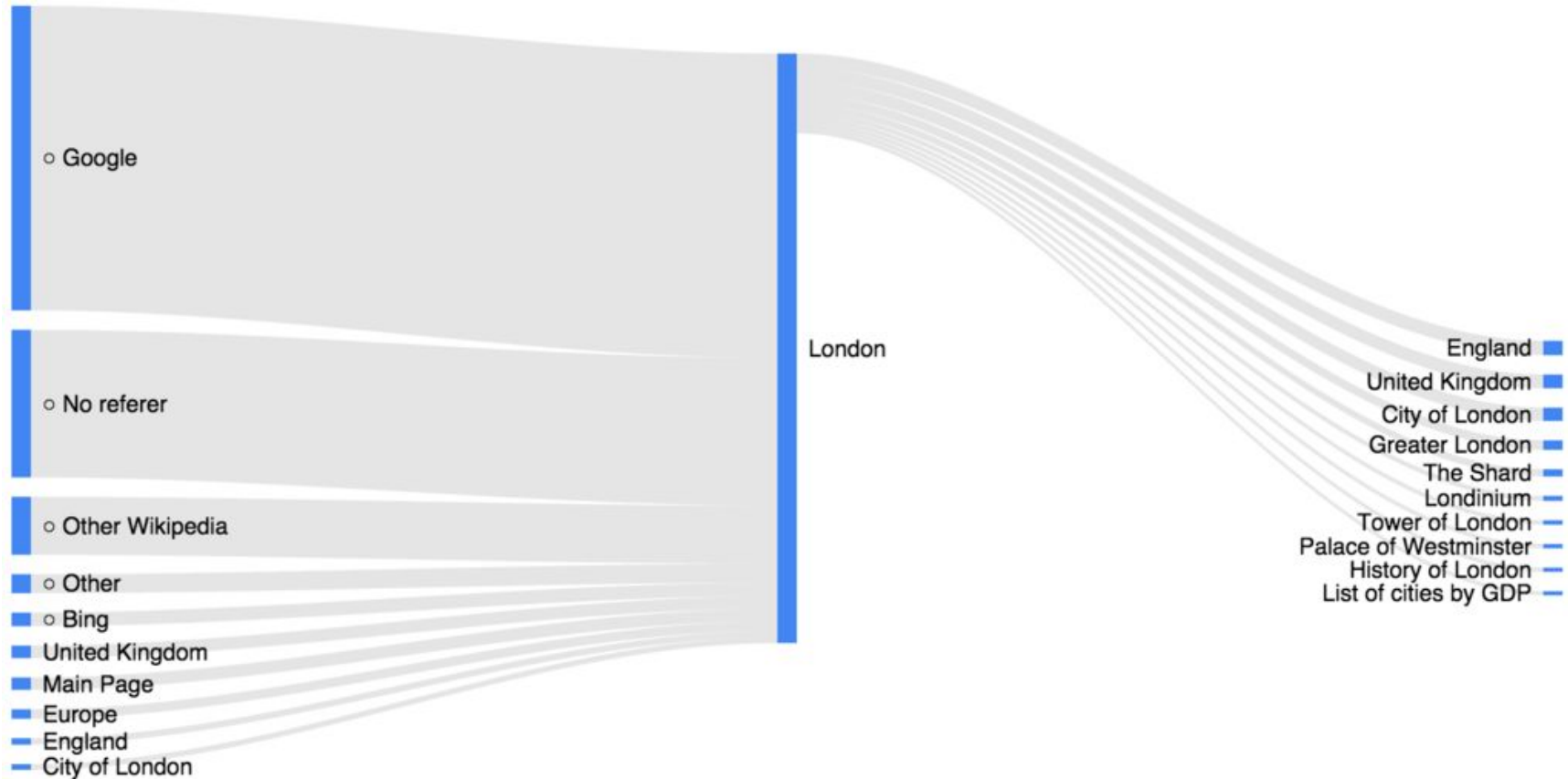
Statistics: stats.wikimedia.org



Pageviews: pageviews.toolforge.org



Click Dataset (a.k.a Clickstream)



Wikidata

Wikidata is a free and open knowledge base that can be read and edited by both humans and machines.

Wikidata acts as central storage for the **structured data** of its Wikimedia sister projects including Wikipedia, Wikivoyage, Wikisource, and others.

In October 2018, there 23 M of edits in Wikidata, compared with around 4 M edits in English Wikipedia



- <https://www.wikidata.org/>
- <https://query.wikidata.org/>



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The Free Encyclopedia

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New York University

From Wikipedia, the free encyclopedia

Coordinates: 40°43′48″N 73°59′42″W﻿ / ﻿

This article is about the private institution founded in 1831. For other and similar uses, see [University of New York](#).

"Nyu" redirects here. For the district in Japan, see [Nyū District, Fukui](#). For the Elfen Lied character, see [List of Elfen Lied characters § Nyu](#).

New York University (NYU) is a [private nonprofit research university](#) based in [New York City](#).

Founded in 1831, NYU's primary campus is in [Greenwich Village](#) with other campuses throughout New York City.^{[12][13]} NYU students can also study abroad at its degree-granting campuses in [NYU Abu Dhabi](#) and [NYU Shanghai](#), as well as its 11 academic centers in [Accra](#), [Berlin](#), [Buenos Aires](#), [Florence](#), [London](#), [Madrid](#), [Paris](#), [Prague](#), [Sydney](#), [Tel Aviv](#), and [Washington, D.C.](#)^{[14][15]}

In 2018, NYU was ranked amongst the top 30 universities internationally by the [Academic Ranking of World Universities](#), [Times Higher Education World University Rankings](#), and [U.S. News & World Report](#).^{[16][17][18]} For the class that matriculated in the fall of 2018, NYU received 75,037 applications for its undergraduate programs; this is more applications than any other private college or university in the United States.^[19]

Alumni include heads of state, royalty, eminent scientists, inventors and entrepreneurs, media figures, founders and CEOs of [Fortune 500](#) companies, and astronauts.^{[20][21][22]} As of 2018, [37 Nobel Laureates](#), [7 Turing Award winners](#), [5 Fields Medalists](#), over 30 [Academy Award](#) winners, over 30 [Pulitzer Prize](#) winners, and hundreds of members of the [National Academies of Sciences](#) and [United States Congress](#) have been affiliated as [faculty](#) or [alumni](#). Globally, NYU is ranked 7th by the Times Higher Education World University Rankings for producing alumni who are millionaires, and 4th by

< The template *Infobox university* is being considered for merging. >

New York University



Latin: *Universitas Neo Eboracensis*

Motto	<i>Perstare et praestare</i> (Latin)
Motto in English	To persevere and to excel
Type	Private ^[1]
Established	1831 ^[1]
Endowment	\$4.1 billion (2018) ^[2]

New York University (Q49210)

private research university in New York, NY, United States

NYU | University of the City of New York | University of New York

[edit](#)

[In more languages](#) [Configure](#)

Language	Label	Description	Also known as
English	New York University	private research university in New York, NY, United States	NYU University of the City of Ne... University of New York
Spanish	Universidad de Nueva York	universidad estadounidense	
Traditional Chinese	紐約大學	No description defined	
Chinese	纽约大学	私立研究型大学在美国纽约州纽约市	

[All entered languages](#)

Statements

instance of	<div><div></div><div>private university</div></div>	<div><div></div><div>edit</div></div>
	<div><div></div><div>↳ 0 references</div></div>	<div><div></div><div>add reference</div></div>
	<div><div></div><div>research university</div></div>	<div><div></div><div>edit</div></div>
	<div><div></div><div>↳ 0 references</div></div>	<div><div></div><div>add reference</div></div>
	<div><div></div><div>private not-for-profit educational institution</div></div>	<div><div></div><div>edit</div></div>
	<div><div></div><div>↳ 1 reference</div></div>	
		<div><div></div><div>add value</div></div>

Wikipedia (59 entries) [edit](#)

ar	جامعة نيويورك
ast	Universidá de Nueva York
azb	نیویورک بیلیم‌بورجو
az	Nyu-York Universiteti
be_x_old	Нью-Ерскі ўніверсітэт
be	Нью-Ерскі ўніверсітэт
bg	Нюйоркски университет
bn	নিউ ইয়র্ক বিশ্ববিদ্যালয়
ca	Universitat de Nova York
cs	New York University
da	New York University
de	New York University
eml	Università 'd New York
en	New York University
eo	Universitato de Novjorko
es	Universidad de Nueva York
et	New Yorgi Ülikool
eu	New Yorkeko Unibertsitatea
fa	دانشگاه نیویورک
fi	New Yorkin yliopisto
fr	Université de New York
gl	Universidade de Nova York
he	אוניברסיטת ניו יורק
hi	न्यूयॉर्क विश्वविद्यालय
hu	New York Egyetem
hy	Նյու Յորքի համալսարան
id	Universitas New York

image



NYU07.JPG

2,592 × 1,952; 2.42 MB

▼ 0 references

Data Sources

- Dumps
- Wikimedia API
- SQL Replicas / Quarry
- Event Stream
- Wikidata
- **Commons**

Wikipedia images: 5 Million on English Wikipedia only, most with categories

About 43% is captioned, and 10% alt-captioned



Example of good Alt Text: Coloured drawing of a huge octopus rising from the sea and attacking a sailing ship's three masts with its spiraling arms

Image: [Colossal octopus by Pierre Denys de Montfort.jpg](#)

Image by en: Pierre Denys de Montfort.
uploaded by en: user:Salleman.,
Public Domain.



Example of bad Alt Text: Photograph

Caption: User's eye view of the "VCS 3";^[# 1] top left, three main oscillators; bottom left, patch panel; bottom right, joystick. External keyboard not shown.

Note: it has printed logo: "V.C.S. 3".

Image: [EMS VCS 3.jpg](#)

Image by The Standard Deviant - CC BY-SA 2.0,

(Almost) all images come from one source:
Wikimedia Commons



Building Solutions: Generate lists of images from a specific class

Let's say we are want to generate a list of all pictures containing "Cats"

- **Manual** search: https://commons.wikimedia.org/wiki/Main_Page
- **API-search:** Use API to retrieve search results
<https://commons.wikimedia.org/w/api.php?action=query&list=search&srnamespace=6&srsearch=cats>
 - Search a specific Category:
https://commons.wikimedia.org/w/api.php?action=query&list=categorymembers&cmtitle=Category:Felis_silvestris_catus
 - Structured data search:
<https://commons.wikimedia.org/w/api.php?action=query&list=search&srnamespace=6&srsearch=haswbstatement:P180=Q146>

Building Solutions: Generate lists of images from a specific article

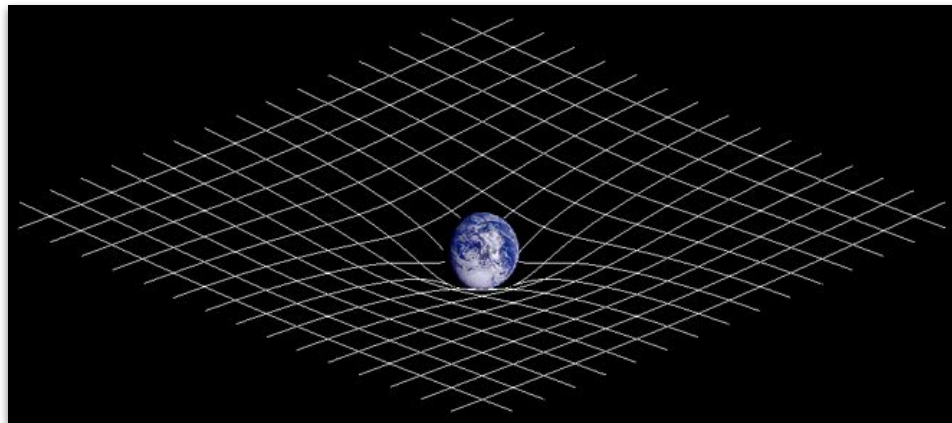
Let's say we are want to generate a list of all pictures from Wikipedia pages related to "Cats". We need to use [SQL Replicas](#)

- Let's extract this list for one specific Wikipedia edition, using the **imagelinks table**:
 - https://it.wikipedia.org/wiki/Felis_silvestris_catus
 - <https://quarry.wmflabs.org/query/38252>

Image: image
content data

ImageLinks:
link between
image and
Wikipedias

Building Solutions: Image/Article/Caption Data



bn: সাধারণ আপেক্ষিকতা তত্ত্ব অনুযায়ী সময় এবং কাল এর বক্রতা একটি দ্বি-মাত্রিক চিত্রের সাহায্যে উপস্থাপন করা হয়েছে।

ja: 一般相対性理論によって記述される、2次元空間と時間の作る曲面。地球の質量によって空間が歪むとして記述して、重力を特殊相対性理論に取り入れる。実際の空間は 3次元であることに注意すべし。

ko: 일반상대성이론에서 묘사된 시공의 곡률을 2차원으로 표현한 그림.

it: Una celebre illustrazione divulgativa della curvatura dello spaziotempo dovuta alla presenza di massa, rappresentata in questo caso dalla Terra.

en: Two-dimensional projection of a three-dimensional analogy of spacetime curvature described in general relativity

ckb: دەر هاوێشتەبەیکی دوور هه‌ندی له چامانه‌وه‌ی کاتجی له بۆشایییه‌کی ستێر هه‌ندیدا، که له تیۆری رێژجی نایشتاینیدا دینه بهر باس.

my: နှိုင်းရသီအိုရီအရ သုံးဖက်မြင် အာကာသအချိန် ကွေးညွတ်ပုံအား နှစ်ဘက်အမြင်ဖြင့် ဖော်ပြထားပုံ

WIT : Wikipedia-based Image Text Dataset

Wikipedia-based Image Text (WIT) Dataset is a large **multimodal multilingual** dataset. WIT is composed of a curated set of 37.6 million entity rich image-text examples with 11.5 million unique images across 108 Wikipedia languages. Its size enables WIT to be used as a pretraining dataset for multimodal machine learning models.

Downloading image files

If we want to analyze images, we need to download the files, so that we can process the pixel data. But here we have only image file names!

- Use the Commons Downloader - a Python Library which also allows to download images for a specific Commons category: <https://pypi.org/project/CommonsDownloader/>
- Other tools for image download:
https://commons.wikimedia.org/wiki/Commons:Tools#Download_media

Building Solutions: Pixel Data

https://analytics.wikimedia.org/published/datasets/one-off/caption_competition/

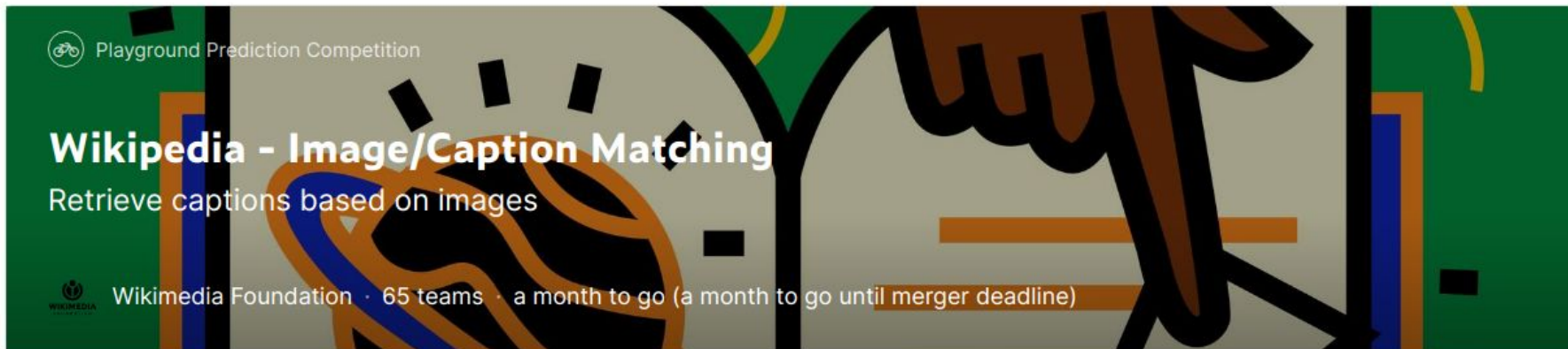
```
# File Format:
## Pixels columns: image_url, b64_bytes, metadata_url
### b64_bytes are the image bytes as a base64 encoded string
## Embedding columns: image_url, embedding
### Embedding: a comma separated list of 2048 float values


# embeddings

@F.udf(returnType='array<float>')
def parse_embedding(emb_str):
    return [float(e) for e in emb_str.split(',')]
# parse embedding array
first_emb = (spark.read
    .csv(path=resnet_embeddings_training+'*.csv.gz', sep="\t")
    .select(F.col('_c0').alias('image_url'),
    parse_embedding('_c1').alias('embedding'))
    .take(1)[0]
)
print(len(first_emb.embedding))
# 2048

# pixels
first_image = (spark
    .read.csv(path=image_pixels_training+'*.csv.gz', sep="\t")
```


Building Solutions: Competitions



 Playground Prediction Competition

Wikipedia - Image/Caption Matching

Retrieve captions based on images

 Wikimedia Foundation · 65 teams · a month to go (a month to go until merger deadline)

[Overview](#) [Data](#) [Code](#) [Discussion](#) [Leaderboard](#) [Rules](#) [Host](#) [Join Competition](#) [...](#)

Data Description

[Edit](#)

The objective of this competition is to predict the target `caption_title_and_reference_description` given information about an images. The targets for this competition are in multiple languages.

Thank You

From Wikipedia, the free encyclopedia

"Thank you" is a common expression of [gratitude](#). It often refers to a [thank you letter](#), a letter written to express appreciation.

✉ {miriam,diego}@wikimedia.org

<http://research.wikimedia.org>