# Quantifying Engagement with Citations on Wikipedia

<u>Tiziano Piccardi</u>, Miriam Redi, Giovanni Colavizza, Robert West









# **Content integrity**

Citing the source

"Citations have several important purposes: [...] to allow the reader to determine independently whether the referenced material supports the author's argument in the claimed way, and to help the reader gauge the strength and validity of the material the author has used." Wikipedia's verifiability policy requires **inline citations** for **any material** challenged or **likely to be challenged**, and for all quotations, anywhere in article space [1].

# Citing the source

## The Web Conference

From Wikipedia, the free encyclopedia

The Web Conference (formerly known as International World Wide Web Conference, abbreviated as WWW) is a yearly international academic conference on the topic of the future direction of the World Wide Web. The first conference of many was held and organized by Robert Cailliau in 1994 at CERN in Geneva, Switzerland. The conference has been organized by the International World Wide Web Conference Committee (IW3C2), also founded by Robert Cailliau and colleague Joseph Hardin, ar since. [1] The conference's location rotates among North America, Europe, and Asia and its events usually span a period of five days. The conference aims to provide the influencers, decision makers, technologists, businesses and standards bodies" can both present their ongoing work, research, and opinions as the field. [1]

The conference series is aimed at providing a global forum for discussion and debate in regard to the standardization of its associated technologies on society and culture. Developers, researchers, internet users as well as commercial ventures and organizations come together the impact of said reference to discuss the latest advancements of the Web and its evolving uses and trends, such as the development and popularization of the eTV and eBusiness. [2] The conferences usually include a variety of events, such as tutorials and workshops, as well as the main conference and special dedications of space in memory of the history of the Web and specific notable events. [3] The conferences are organized by the IW3C2 in collaboration with the World Wide Web Consortium (W3C), Local Organizing Committees, and Technical Program Committees. [4]

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# Understanding readers' interactions with references is crucial:

- to understand the role of editors and policies in maintaining high quality information
- to study what can increase interest in the reference content
- to design visualizations and tools to support content referencing



To **what extent** do **users engage** with citations when reading Wikipedia?



What **features of a page** predict whether a reader will interact with a citation on the page?



What **features of a citation** predict whether a reader will interact with it?

From Wikipedia, the free encyclopedia

Wikipedia (/,wIkI'pi:diə/ (♣) listen) wik-ih-PEE-dee-ə or /,wIki'pi:diə/ (♣) listen) wik-ee-PEE-dee-ə) is a multilingual online encyclopedia created and maintained as an open collaboration project<sup>[3]</sup> using a wiki-based editing system <sup>[4]</sup> It is the largest and most popular general reference work on the World Wide Web,<sup>[5]</sup>[6][7] and is one of the most popular websites ran free content and no commercial ads, and is owned and supported by the Wikime through donations.<sup>[9]</sup>[10][11][12]

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fnHover Shin, Annys (January 5, 2017). "Wikipedia was born in 2001. And the world got a bit truthier" . The Washington Post, Retrieved March 22, 2019.

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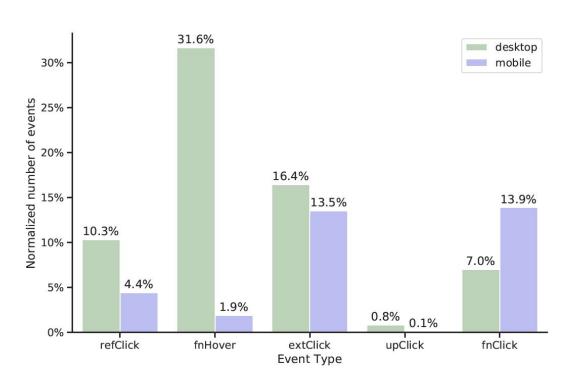
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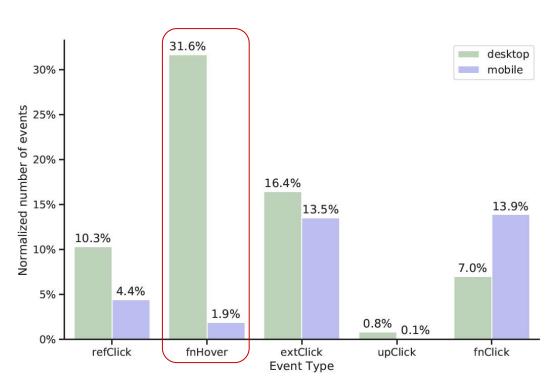


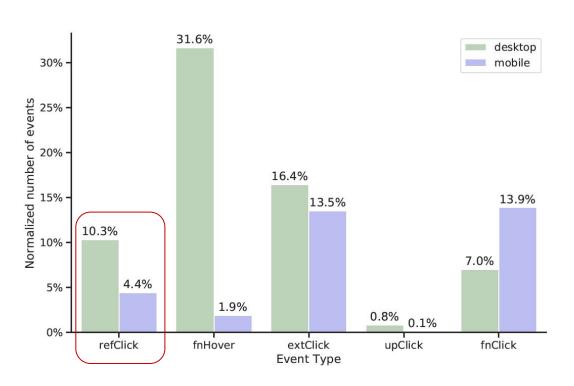
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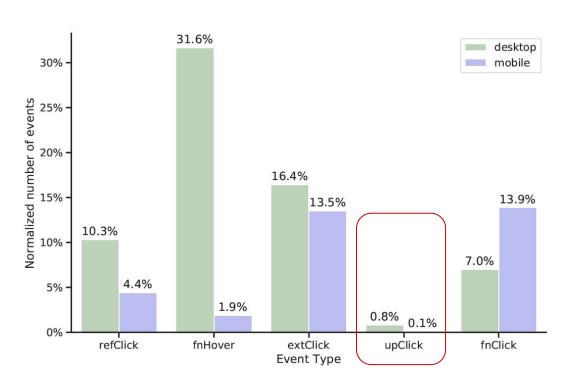
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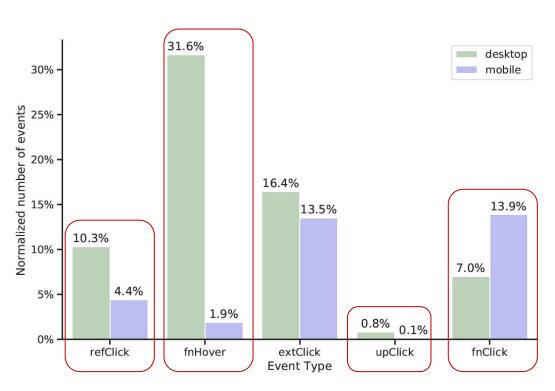
- English Wikipedia
- Client-side instrumentation
- 2 main rounds 4 weeks (33% sampling):
  - October '18
  - April '19
- Privacy constraints:
  - All data comes from non logged-in users only.
  - We stored only anonymised summaries.
  - Sensitive data purged after 90 days.













To what extent do users engage with citations when reading Wikipedia?

# Citation Click-through rate

Page loads with at least 1 click

Total page loads

Given random page-load, what is the probability of observing an interaction with the references?

# Probability of at least 1 citation click

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Available in Owner Created by 303 languages Wikimedia Foundation Jimmy Wales

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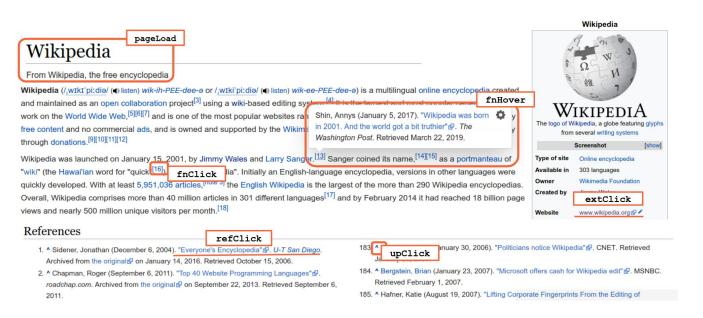
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# **Transition probability**

## Example:

pageLoad → pageLoad → fnHover → refClick → END



From Wikipedia, the free encyclopedia

pageLoad

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Wikipedia was launched on January 15, 2001, by Jimmy Wales and Larry Sanger. [13] Sanger coined its name. [14][15] as a portmanteau of "wiki" (the Hawai'ian word for "quick [16]) ia". Initially an English-language encyclopedia, versions in other languages were fnClick quickly developed. With at least 5,951,036 articles, [note 3] the English Wikipedia is the largest of the more than 290 Wikipedia encyclopedias. Overall, Wikipedia comprises more than 40 million articles in 301 different languages [17] and by February 2014 it had reached 18 billion page views and nearly 500 million unique visitors per month. [18]

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28

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Wikipedia



The logo of Wikipedia, a globe featuring glyphs

[show]

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References

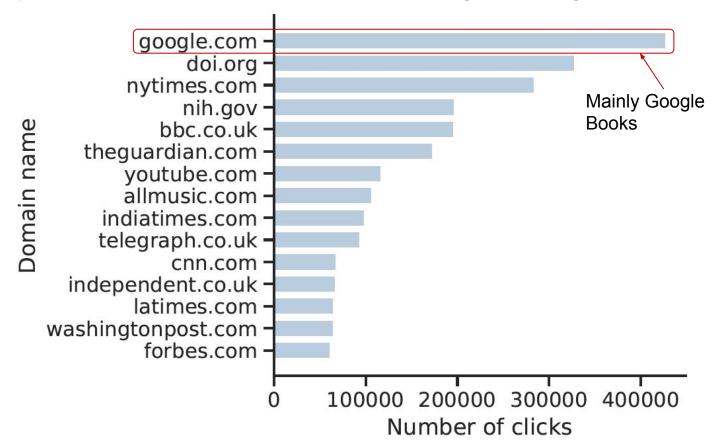
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# Top destination of readers leaving through the references



# RQ1: Take away

• 1 in 340 page loads has clicks on the references

• 1 in 70 page loads has hover events

 The most frequent destination of the outgoing traffic from Wikipedia are Google subdomains, scientific articles, and news websites.



What **features of a page** predict whether a reader will interact with a citation on the page?

## From the page source code

- Page length
- Number of references

## From page-load data

Popularity

## From Wikimedia ORES (Scoring Platform)

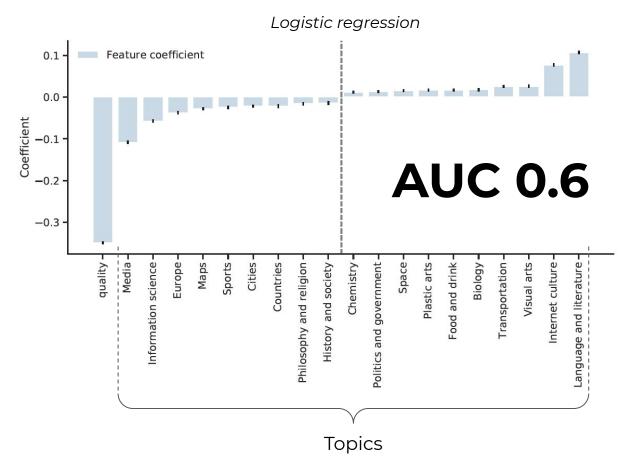
- Topics
  - Vector of 42 topics: Sports, Art, Medicine, Science, Space...
- Quality class
  - Stub, Start, C-Class, B-Class, Good Article, Featured Article

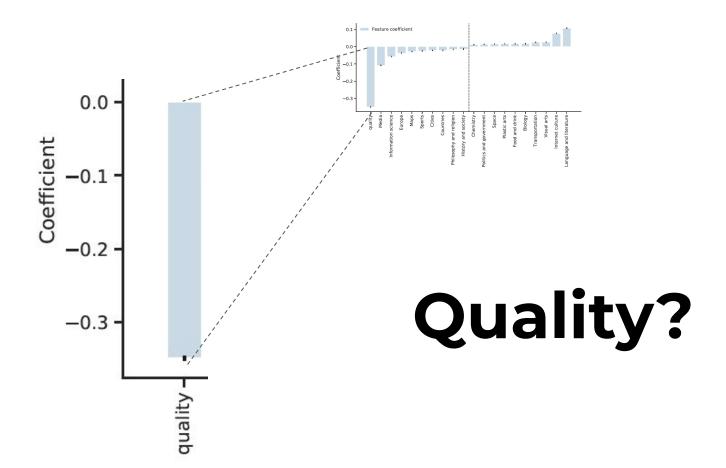
# **52** page features

#### **Dataset:**

From the same session we extracted one page load with click (positive) on references and one without (negative).

938K sample



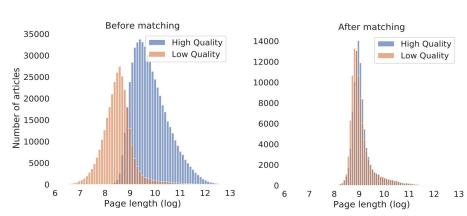


#### Matched dataset using propensity score

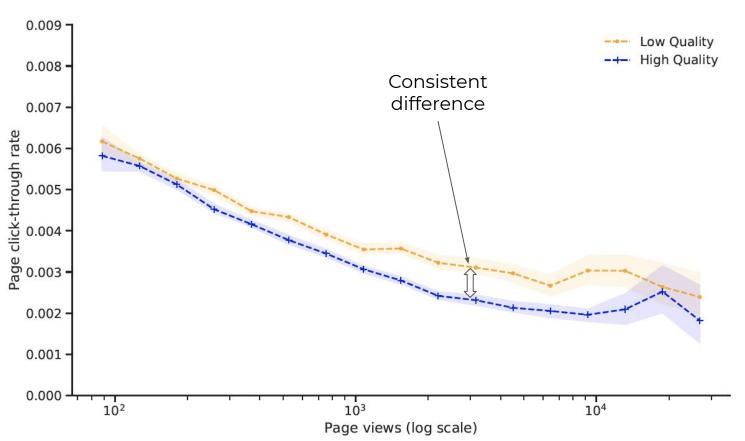
Forced conditions: at least 100 page-loads in 4 weeks, difference in length no more than 10%

#### 854K samples





# Effect of Quality (Blue, Orange) and Popularity (X) on Click-through rate



#### Even stronger result by investigating

# page length

(one of the feature contributing to quality)

Controlling for type of article and readers community

# RQ2: Take away

- Readers tend to interact more (1) on the references of pages with limited content: short articles and with poor quality.
- Popular articles have lower CT rate.



# What **features of a citation**predict whether a reader will interact with it?

#### Matched dataset

One references with interaction and one without, taken from the same page-load.

#### 1.8M pairs

#### Constraints:

- Negative: the closest reference
- One pair per reader

#### Features analysis

The words with higher positive contribution in the prediction are

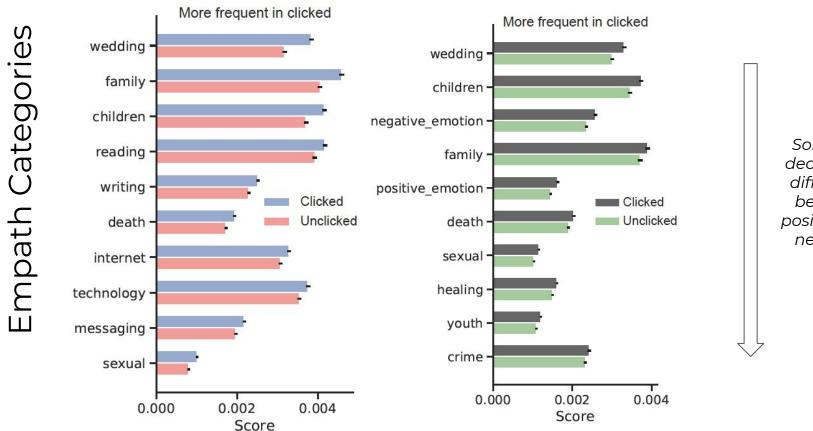
**Case 1:** about recent events 2019

**Case 2:** about open access resources *Free*, *PDF* 

Case 3: about human aspects born, died, relationship, family, wife, ...



#### Hover event



Sorted by decreasing difference between positive and negative

### What we learned

- RQ1: 1 in 340 page-views has clicks on the references, and 1 in 70 has hover events
- RQ2: Readers tend to engage more with the references of short pages. In relative terms (CTR), popular pages shows less interaction with the references
- RQ3: Readers engage more with references about recent events, describing human aspects, and offering open access

## What are the implications?

Results enable researchers to **develop novel theories** about readers' **information needs**.

Results can support prioritizing efforts towards **improving information reliability**.

We observed the **importance** of **open access** and **open science** initiatives.

## In Practice for Wikipedia?

Design of model to predict lack of information by using signal from interaction patterns.

Prioritize the content to expand based not the interaction level.

Prioritize the sentences that need a reference based on the readers interest.

## Thank You

From Wikipedia, the free encyclopedia

"Thank you" is a common expression of gratitude.

@tizianopiccardi

https://meta.wikimedia.org/wiki/Research:Characterizing\_Wikipedia\_Citation\_Usage