

Which parts of an article are actually being read?

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Beyond pageviews

What knowledge do people access on Wikimedia projects, and how often?

Pageview numbers have been our main source for answering this question.

However, they only tell us how often a page is opened - not how much of it is being read.



This talk

- **Tour through some new data sources that became available in recent years**
- **These come from academic research or from data WMF collected during work on software features (products). But they yield insights for editors too.**
- **Myself: Analyst in the WMF Audiences (product) department, Wikipedia editor since 2003**



Data on scroll actions

On the Android Wikipedia app,

Around 32% of pageviews do not involve scrolling down - i.e. reader looks only at the top of the page.



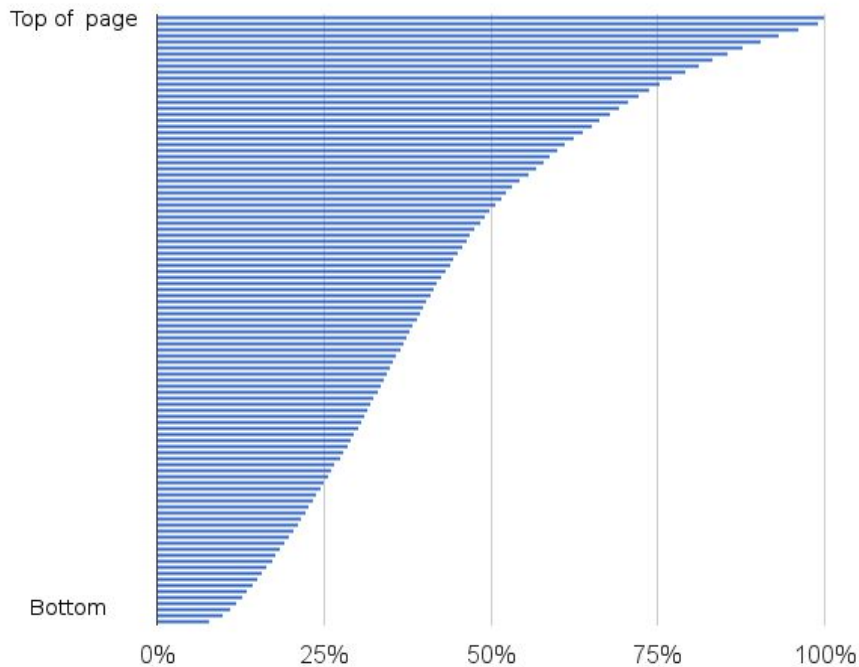
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Scrolling data

On the Android Wikipedia app,

- **The bottom of the page is only reached on about 5% of pageviews**
- **Only 25% of users ever reached the end of any page (during one week)**

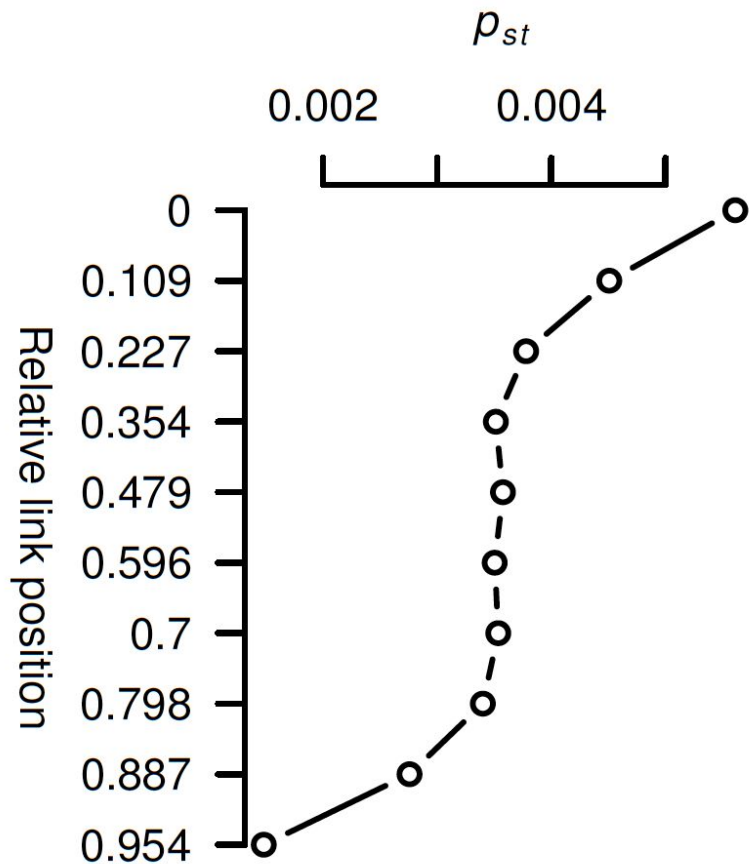
Lowest page position viewed (on Android app)



Clickstream data

Public dataset by WMF, counting how often wikilinks are followed from one page to the other.

Likewise indicates that the top of an article is read much more often than its end.



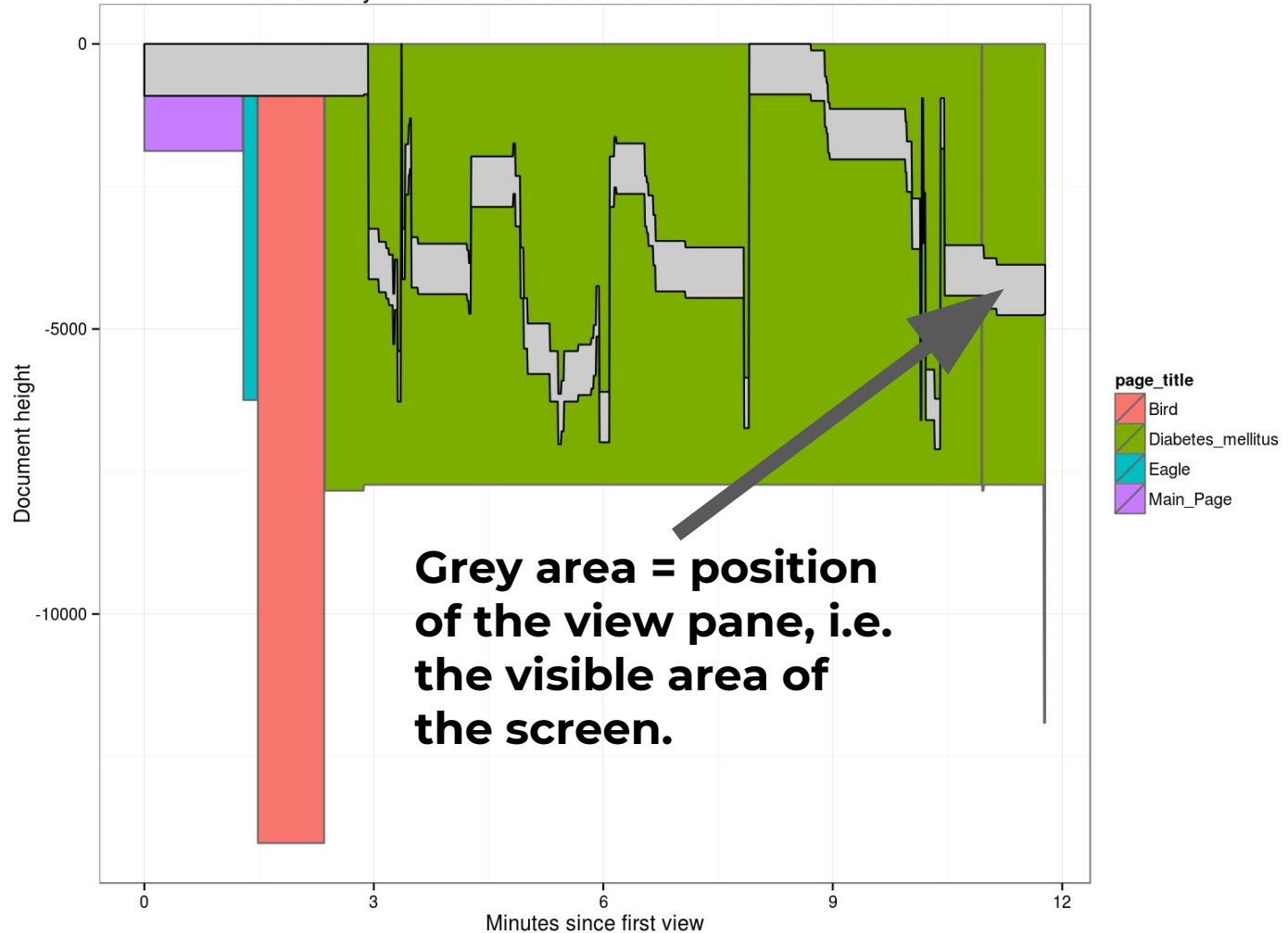
Clickthrough rate of wikilinks vs. their position on the source page, 0=top, 1=bottom (from [Paranjabe et al.](#))

Pages may not be read linearly.

Here, the reader moved through several Wikipedia articles, jumping up and down, while looking for a specific fact about diabetes.

[\(Mechanical Turk experiment by Halfaker et al., 2013\)](#)

View activity for turker: 3171965216456534627035bbdc521875



Eyetracking studies

Expensive lab equipment allows to find out which part of the screen a user looks at.

WMF has never used this so far, but several academic researchers (from Germany and Scotland) have applied it to (desktop) Wikipedia.



Eyetracking

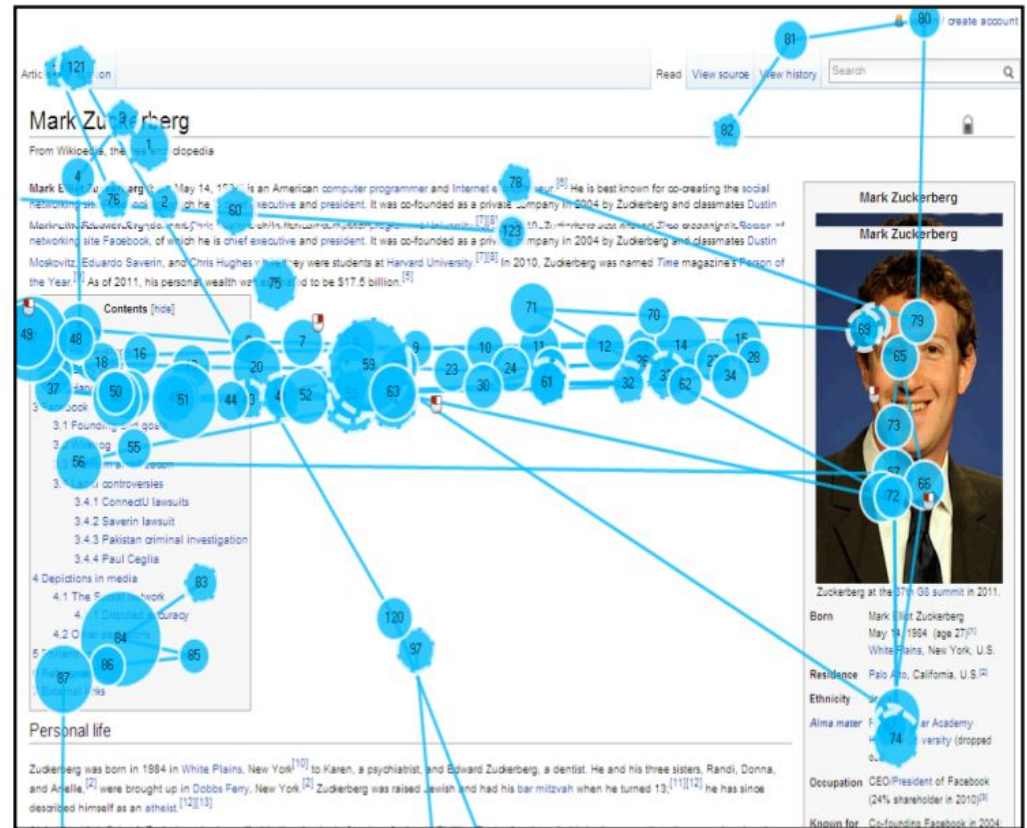


Figure 1. Gaze plots example from Mark Zuckerberg article. The dots are fixations, larger dots mean greater fixation durations and the lines between the fixations are saccades.

Insights from eyetracking studies

- Most readers look first at TOC, then infobox.
- In "lookup" tasks, >45% of time is spent scanning TOC and lists.
- In "learn" tasks, it's <10%.
- Images provide visual orientation, too:
 - “39% of all [eye] contact points lead from image to image, in mutual directions (previous or next).“

([sources](#))

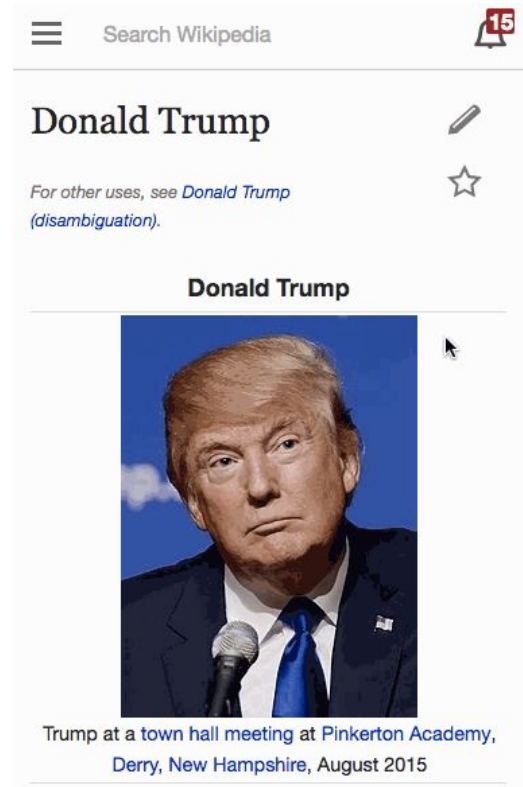


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Section expansions

On the mobile web version
of Wikipedia, article
sections are collapsed until
the reader taps the heading

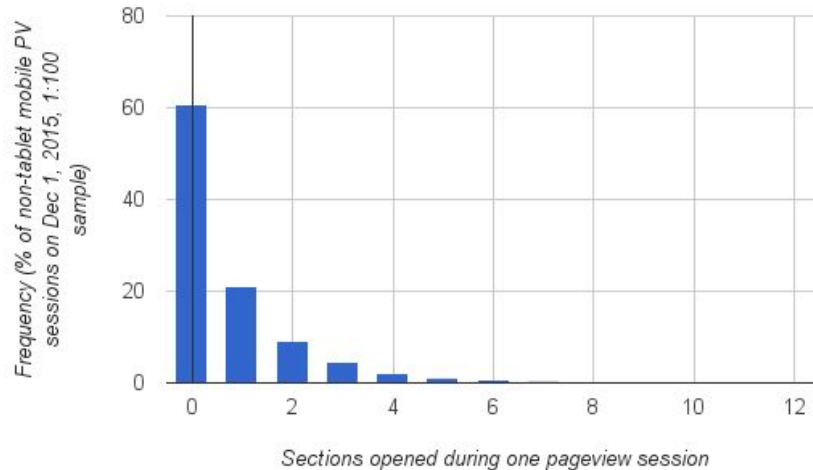
We instrumented this for an
A/B test, and now have
some data about how often
each section is accessed



[\(click for animated screencast\)](#)

On 60% of mobile pageviews, not a single section is opened, i.e. the reader only looks at the introduction.

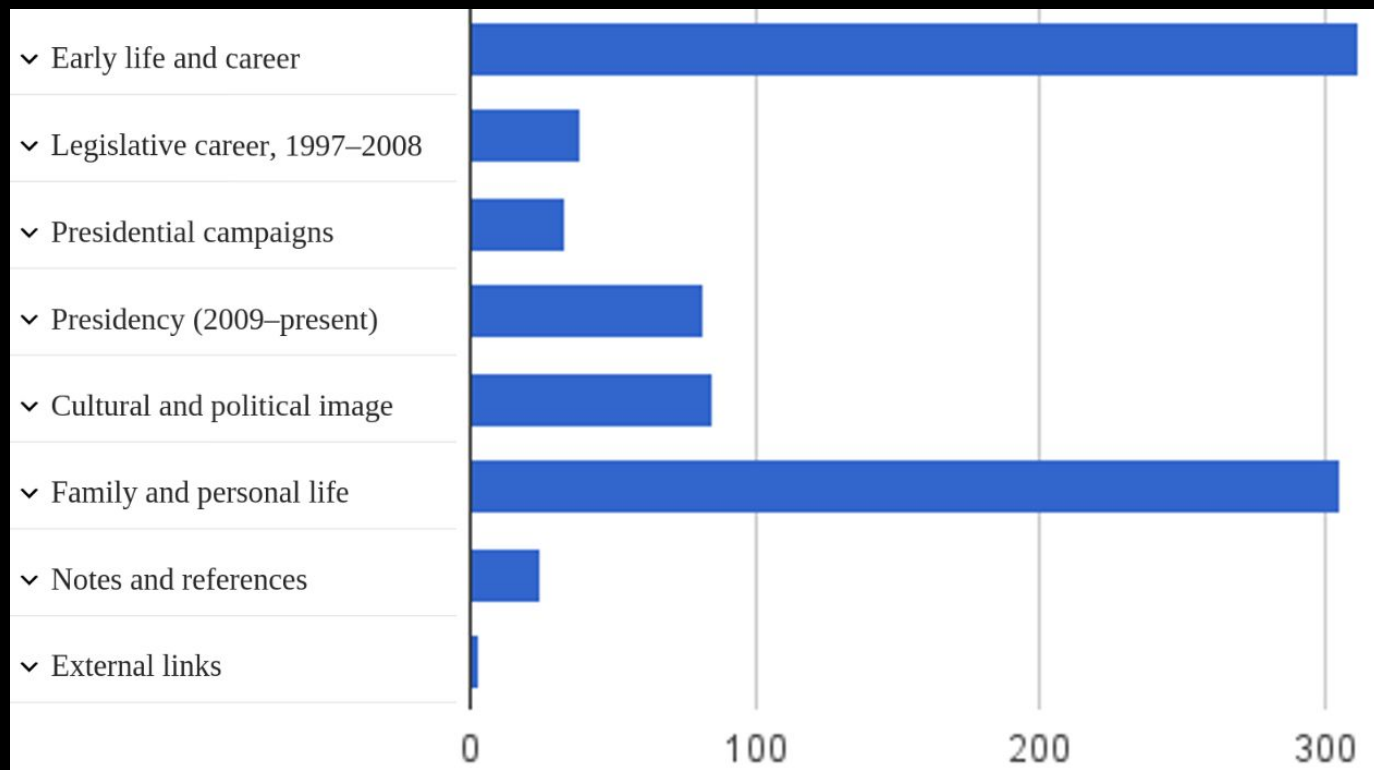
Number of sections opened per pageview



Much more interest for personal aspects (“Early life and career”) than for political work (“Legislative career”, “presidency”)

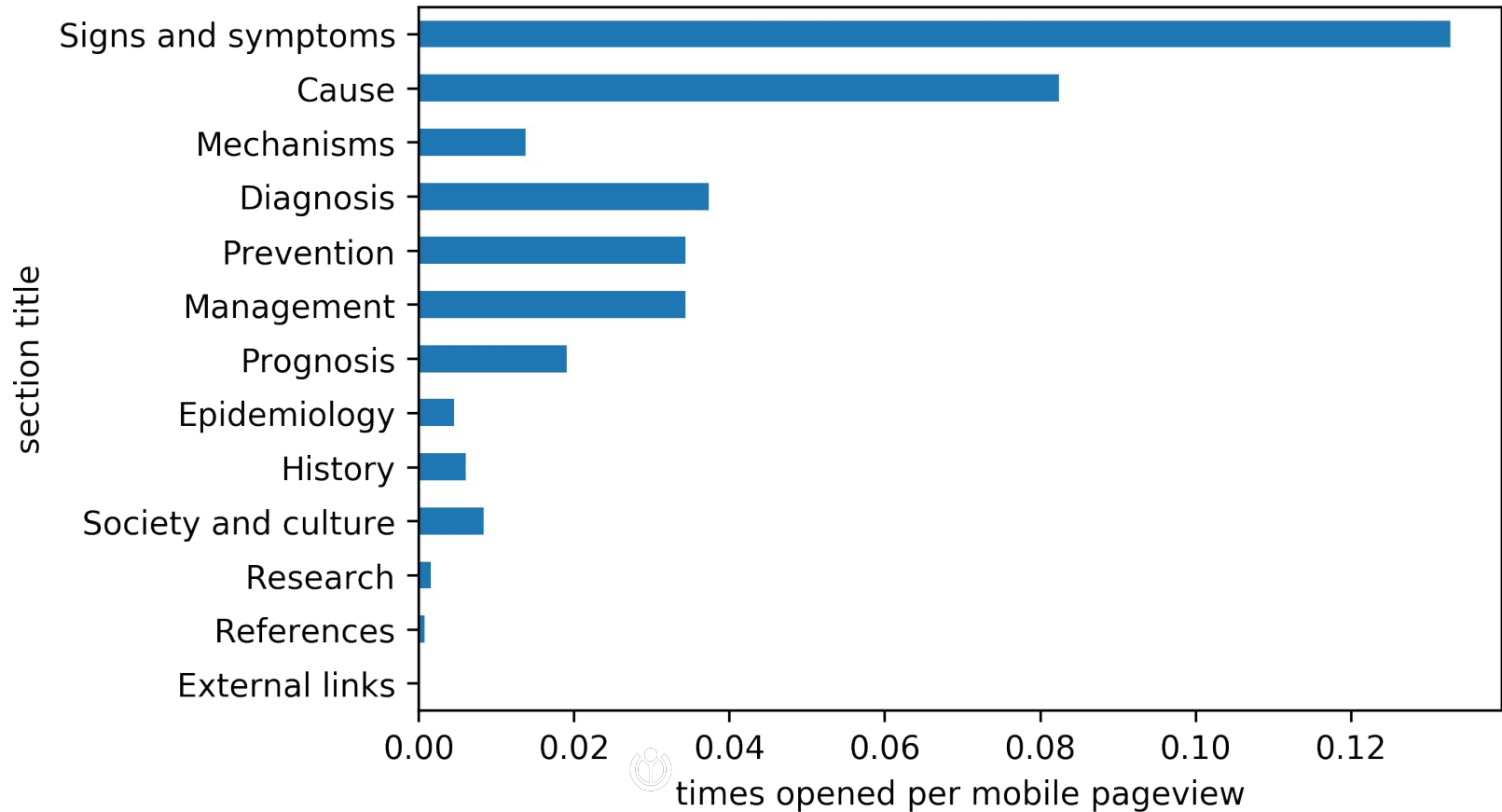
Almost no-one views “external links”

Article “Barack Obama” (English Wikipedia)

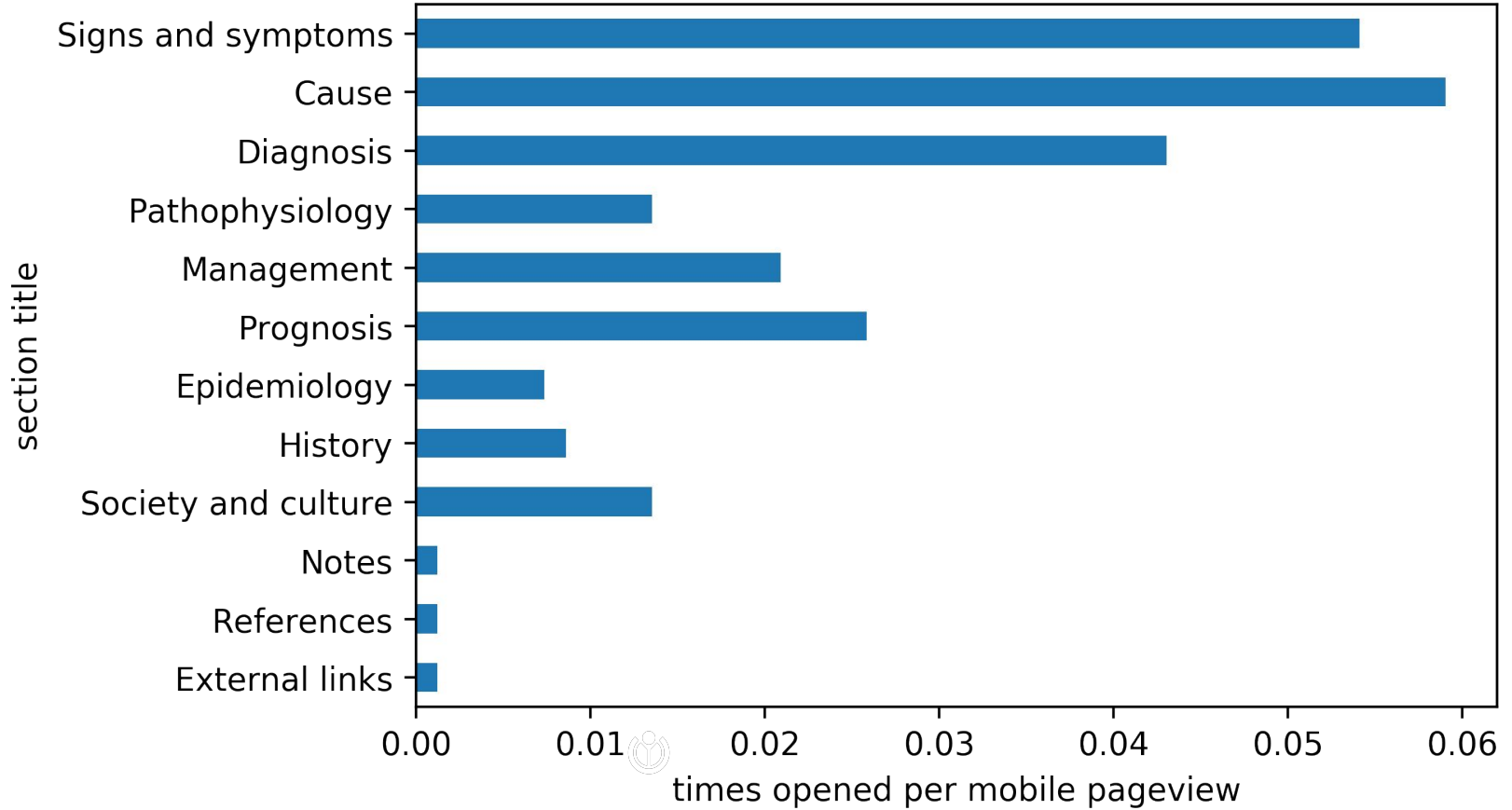


Times opened in sample (Dec 2015-Jan 2016)

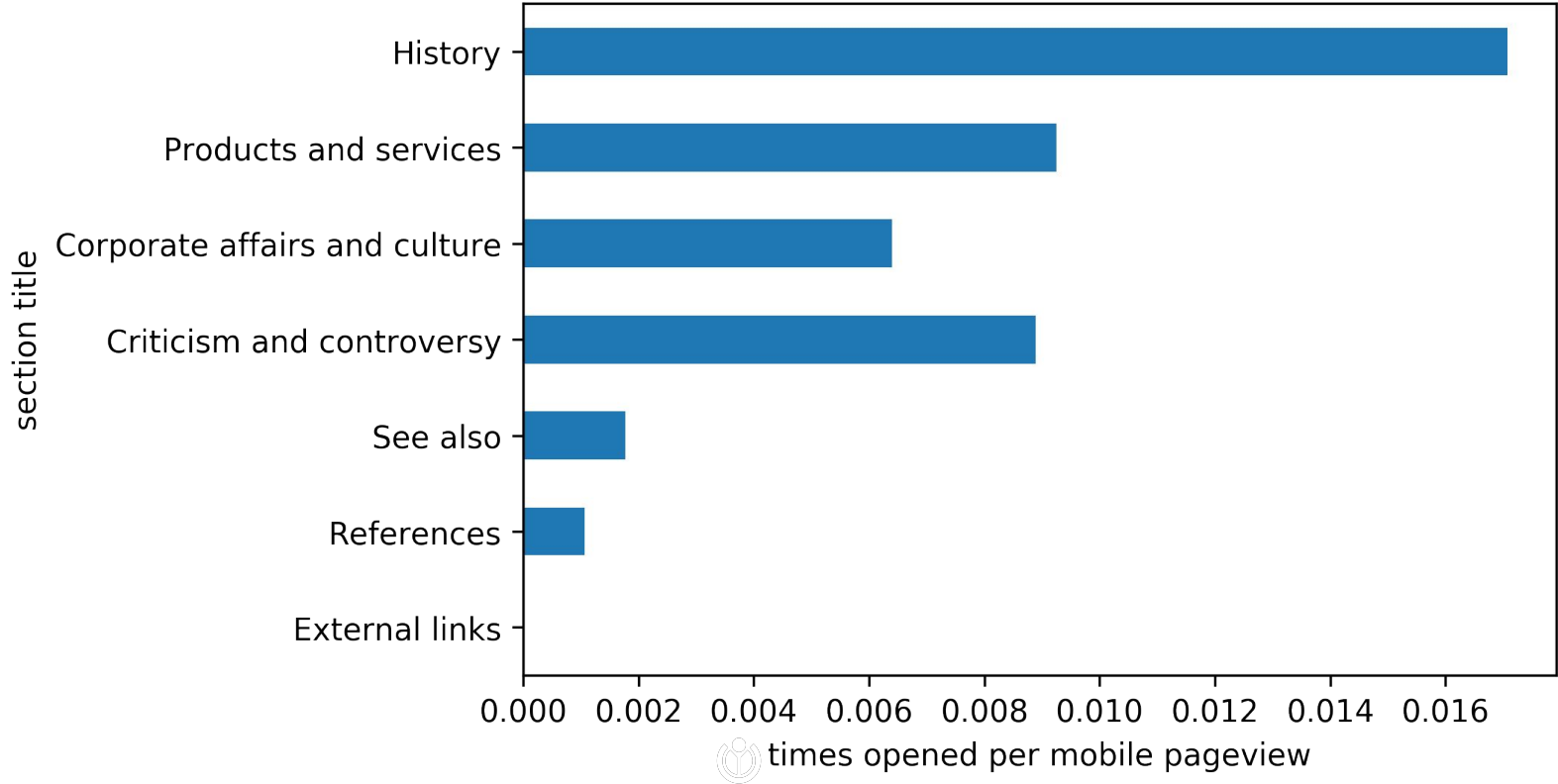
[[en:Pneumonia]]



[[en:Sepsis]]



[[en:Google]]



Some takeaways from these and other pages

- **Mobile web readers seem very uninterested in the “external links” section.**
- **“References” is rarely opened as well (but footnotes can also accessed from the text).**
- **Lower section less popular, but heading/topic seems to matter.**

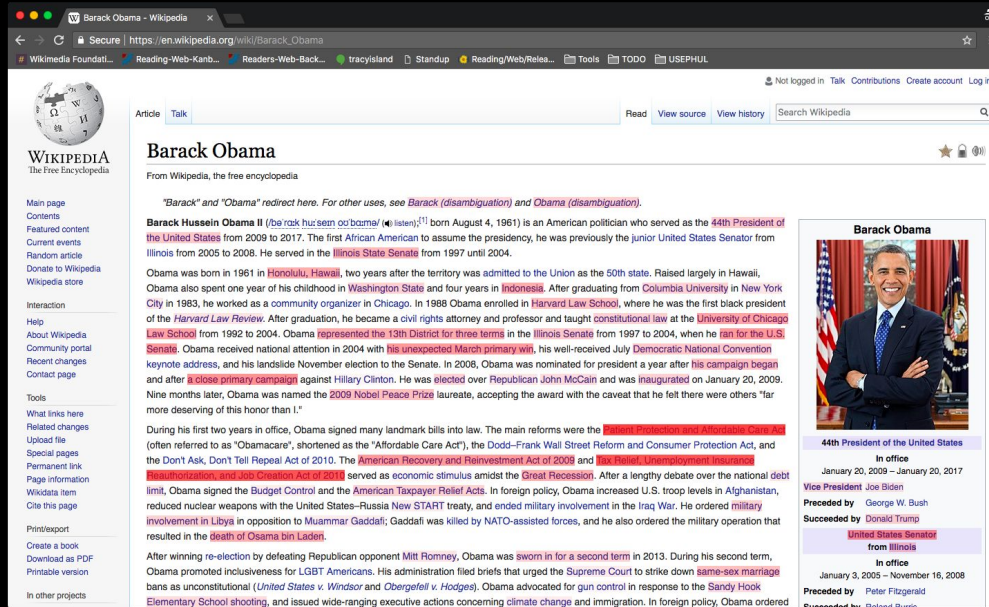


Page previews data

- [New feature](#) (2017/18) on desktop Wikipedia
- Reader hovers over a link to see an excerpt of the linked data
- Heatmap of hovers shows which parts of the page were read, but also which topics(links) readers are interested in looking up briefly from the source page



Page previews data



The screenshot shows a web browser displaying the Wikipedia article for Barack Obama. The browser's address bar shows the URL https://en.wikipedia.org/wiki/Barack_Obama. The page title is "Barack Obama" and the subtitle is "From Wikipedia, the free encyclopedia". The main content area contains a paragraph about Barack Hussein Obama II, including his birth date (August 4, 1961), his role as the 44th President of the United States (2009-2017), and his previous role as a U.S. Senator from Illinois (2005-2008). It also mentions his education at Columbia University and Harvard Law School, and his work as a community organizer in Chicago. The sidebar on the left contains various navigation options such as "Main page", "Contents", "Featured content", "Current events", "Random article", "Donate to Wikipedia", "Wikipedia store", "Interaction", "Help", "About Wikipedia", "Community portal", "Recent changes", "Contact page", "Tools", "What links here", "Related changes", "Upload file", "Special pages", "Permanent link", "Page information", "Wikidata item", "Cite this page", "Print/export", "Create a book", "Download as PDF", "Printable version", and "In other projects".



Thank you! Questions?

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[\[\[meta:Research:Which parts of an article do readers read\]\]](#)



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