## Wikipedia usage survey results

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## Summary

• Wikipedia consumption is skewed pretty heavily towards a certain profile of people. Vipul's Facebook friends and Slate Star Codex readers sample much more heavily from that profile than general United States Internet users. (more)

- Tentatively, these heavy users tend to be more "elite" and influential. This
  led us to revise upward our estimate of the impact per pageview, and
  revise downward our estimate of the reach and broad appeal of Wikipedia.
  (more)
- The gap between elite samples of Wikipedia users and general United States Internet users is significantly greater than the gap between the different demographics within the United States that we measured. It is comparable to the gap between United States Internet users and Internet users in low-income countries. (more)
- Vipul Naik and I are interested in understanding how people use Wikipedia. One reason is that we are getting more people to work on editing and adding content to Wikipedia. We want to understand the impact of these edits, so that we can direct efforts more strategically. We are also curious!
- We conducted surveys of Wikipedia usage. We collected survey responses from audience segments include Slate Star Codex readers, Vipul's Facebook friends, and a few United States audiences through SurveyMonkey Audience and Google Surveys (known at the time as Google Consumer Surveys). Our survey questions measured how heavily people use Wikipedia, what sort of pages they read or expected to find, the relation between their search habits and Wikipedia, and other actions they took within Wikipedia.
- Different audience segments responded very differently to the survey. Notably, the SurveyMonkey and Google Surveys audiences (which are closer to being representative of the general United States Internet-using population) appear to use Wikipedia a lot less than Vipul's Facebook friends and Slate Star Codex readers. Their consumption of Wikipedia is also more passive: they are less likely to explicitly seek Wikipedia pages when searching for a topic, and less likely to engage in additional actions on Wikipedia pages. Even the college-educated SurveyMonkey audience used Wikipedia very little.
- After we conducted the survey and published the first version of this blog post, the Wikimedia Foundation's Global Reach team published the results of their New Readers surveys in Nigeria, India, Mexico, Brazil, and Egypt. These surveys have some overlap with the surveys we conducted. Unsurprisingly, Wikipedia usage in the New Readers surveys is lower than for the general United States audiences in our surveys.
- This was my first exercise in survey construction. I learned a number of lessons about survey design in the process.
- All the survey questions, as well as the breakdown of responses for each
  of the audience segments, are described in this post. Links to PDF exports
  of response summaries are at the end of the post.

### Background

### First SurveyMonkey survey (S1)

At the end of May 2016, Vipul Naik<sup>1</sup> and I created a Wikipedia usage survey<sup>2</sup> to gauge the usage habits of Wikipedia readers and editors. SurveyMonkey<sup>3</sup> allows the use of different "collectors" (i.e. survey URLs that keep results separate), so we circulated several different URLs among four locations to see how different audiences would respond. The audiences were as follows:

• SurveyMonkey's United States audience with no demographic filters (62 responses, 54 of which are full responses).

Acquisition cost: \$100 (\$2 per response for 50 responses, 4 extra responses given gratis)

 Vipul Naik's timeline (post asking people to take the survey<sup>4</sup>; 70 responses, 69 of which are full responses). For background on Vipul's timeline audience, see his page on how he uses Facebook<sup>5</sup>.

Acquisition cost: None

• The Wikipedia Analytics mailing list<sup>6</sup> (email linking to the survey<sup>7</sup>; 7 responses, 6 of which are full responses). Note that due to the small size of this group, the results below should not be trusted, unless possibly when the votes are decisive.

Acquisition cost: None

• Slate Star Codex (post that links to the survey<sup>8</sup>; 618 responses, 596 of which are full responses).

While Slate Star Codex isn't the same as LessWrong, we think there is significant overlap in the two sites' audiences (see e.g. the recent LessWrong diaspora survey results<sup>9</sup>).

Acquisition cost: None

• In addition, although not an actual audience with a separate URL, several of the tables we present below will include an "H" group; this is the heavy users group of people who responded by saying they read 26 or more articles per week on Wikipedia. This group has 179 people: 164 from Slate

<sup>&</sup>lt;sup>1</sup>http://lesswrong.com/user/VipulNaik/overview/

<sup>&</sup>lt;sup>2</sup>https://meta.wikimedia.org/wiki/Research:Wikipedia\_usage\_survey

<sup>&</sup>lt;sup>3</sup>https://en.wikipedia.org/wiki/SurveyMonkey

<sup>&</sup>lt;sup>4</sup>https://www.facebook.com/vipulnaik.r/posts/10208540131276697

<sup>&</sup>lt;sup>5</sup>http://vipulnaik.com/facebook/

<sup>&</sup>lt;sup>6</sup>https://lists.wikimedia.org/mailman/listinfo/analytics

<sup>&</sup>lt;sup>7</sup>https://lists.wikimedia.org/pipermail/analytics/2016-May/005219.html

<sup>8</sup>http://slatestarcodex.com/2016/06/02/links-616-linkandescence/

http://lesswrong.com/lw/nor/2016\_lesswrong\_diaspora\_survey\_analysis\_part\_two/

Star Codex, 11 from Vipul's timeline, and 4 from the Analytics mailing list.

We ran the survey from May 30 to July 9, 2016 (although only the Slate Star Codex survey had a response past June 1).

### Second SurveyMonkey survey (S2)

After we looked at the survey responses on the first day, Vipul and I decided to create a second survey to focus on the parts from the first survey that interested us the most. The second survey was only circulated among SurveyMonkey's audiences:

- SurveyMonkey's US audience with no demographic filters (54 responses). Acquisition cost: \$50 (\$1 per response for 50 responses, 4 extra responses given gratis)
- SurveyMonkey's US audience with the following filters: ages 18–29 with a college or graduate degree (50 responses).

Acquisition cost: \$125 (\$2.50 per response for 50 responses)

We first ran the survey on the unfiltered audience again because the wording of our first question was changed and we wanted to have the new baseline. We then chose to filter for young college-educated people because our prediction was that more educated people would be more likely to read Wikipedia. The SurveyMonkey demographic data does not include education, and we hadn't seen the Pew Internet Research surveys in the next section, so we were relying on our intuition and some demographic data from past surveys) for the "college-educated" part. Our selection of the age group was based on the fact that young people in our first survey gave more informative free-form responses in survey 2 (SurveyMonkey's demographic data *does* include age).

### Google Surveys survey (GS)

We ran a third survey on Google Surveys (known at the time as Google Consumer Surveys) with a *single question* that was a word-to-word replica of the first question from the second survey. The main motivation here was that on Google Surveys, a single-question survey costs only 10 cents per response, so it was possible to get to a large number of responses at relatively low cost, and achieve more confidence in the tentative conclusions we had drawn from the SurveyMonkey surveys.

### Wikimedia Foundation New Readers survey (NR)

In late 2016 (after initial publication of this post), the Wikimedia Foundation's Global Reach team published the results of New Readers phone surveys<sup>10</sup> in the following five countries: Nigeria<sup>11</sup>, India<sup>12</sup>, Mexico<sup>13</sup>, Brazil<sup>14</sup>, and Egypt<sup>15</sup>. For the first three countries, results of additional in-person surveys have also been published. The questions in these surveys have some overlap with the questions in our surveys, so we have updated our post to include a discussion of these surveys and how the results compare with ours.

### Other surveys

Several demographic surveys regarding Wikipedia have been conducted, targeting both editors and users. The surveys we found most helpful were the following:

- The 2010 Wikipedia survey<sup>16</sup> by the Collaborative Creativity Group and the Wikimedia Foundation. The explanation before the bottom table on page 7 of the overview PDF<sup>17</sup> has "Contributors show slightly but significantly higher education levels than readers", which provides weak evidence that more educated people are more likely to engage with Wikipedia.
- The Global South User Survey 2014<sup>18</sup> by the Wikimedia Foundation
- Pew Internet Research's 2011 survey<sup>19</sup>: "Education level continues to be the strongest predictor of Wikipedia use. The collaborative encyclopedia is most popular among internet users with at least a college degree, 69% of whom use the site." (page 3)
- Pew Internet Research's 2007 survey<sup>20</sup>.

We found the Pew Internet Research surveys after conducting our own two surveys (and during the write-up of this document).

There is also the New Readers survey mentioned earlier, that we examine in detail in this post.

<sup>&</sup>lt;sup>10</sup>https://meta.wikimedia.org/wiki/Global\_Reach/Insights

<sup>&</sup>lt;sup>11</sup>https://meta.wikimedia.org/wiki/Global\_Reach/Nigeria\_survey

<sup>&</sup>lt;sup>12</sup>https://meta.wikimedia.org/wiki/Global\_Reach/India\_survey

<sup>&</sup>lt;sup>13</sup>https://meta.wikimedia.org/wiki/Global\_Reach/Mexico\_Survey

<sup>&</sup>lt;sup>14</sup>https://meta.wikimedia.org/wiki/Global\_Reach/Brazil\_survey

<sup>&</sup>lt;sup>15</sup>https://meta.wikimedia.org/wiki/Global\_Reach/Egypt\_survey

<sup>&</sup>lt;sup>16</sup>https://web.archive.org/web/20130717211630/http://wikipediastudy.org/

<sup>&</sup>lt;sup>17</sup>https://web.archive.org/web/20131209060146/http://wikipediastudy.org/docs/ Wikipedia\_Overview\_15March2010-FINAL.pdf

<sup>&</sup>lt;sup>18</sup>https://upload.wikimedia.org/wikipedia/commons/8/8a/Global\_South\_User\_Survey\_ 2014\_-\_Full\_Analysis\_Report.pdf

<sup>&</sup>lt;sup>19</sup>http://www.pewinternet.org/files/old-media/Files/Reports/2011/PIP\_Wikipedia.pdf

<sup>&</sup>lt;sup>20</sup>http://www.pewinternet.org/2007/04/24/wikipedia-users/

### Motivation

Vipul and I ultimately want to get a better sense of the value of a Wikipedia pageview (one way to measure the impact of content creation), and one way to do this is to understand how people are using Wikipedia. As we focus on getting more people to work on editing Wikipedia<sup>21</sup> – thus causing more people to read the content we pay and help to create – it becomes more important to understand who is reading the content, and how they engage with it.

For some previous discussion, see also Vipul's answers to the following Quora questions:

- What are the various parameters that affect the value of a pageview?<sup>22</sup>
- What's the relative social value of 1 Quora pageview (as measured by Quora stats http://www.quora.com/stats) and 1 Wikipedia pageview (as measured at, say, Wikipedia article traffic statistics)?<sup>23</sup>

Wikipedia allows relatively easy access to pageview data (especially by using tools developed for this purpose, including one that Vipul made<sup>24</sup>), and there are some surveys that provide demographic data (see "Previous surveys" above). However, after looking around, it was apparent that the kind of information our survey was designed to find was not available.

We were also driven by our curiosity of how people use Wikipedia.

## **Survey questions**

#### Survey questions for the first SurveyMonkey survey (S1)

For reference, here are the survey questions for the first survey. A dummy/mock-up version of the survey can be found here: https://www.surveymonkey.com/r/PDTTBM8.

The survey introduction said the following:

This survey is intended to gauge Wikipedia use habits. This survey has 3 pages with 5 questions total (3 on the first page, 1 on the second page, 1 on the third page). Please try your best to answer all of the questions, and make a guess if you're not sure.

<sup>&</sup>lt;sup>21</sup>http://contractwork.vipulnaik.com

<sup>22</sup>https://www.quora.com/What-are-the-various-parameters-that-affect-the-value-of-a-pageview/answer/Vipul-Naik
23https://www.quora.com/Whats-the-relative-social-value-of-1-Quora-pageview-as-

<sup>&</sup>lt;sup>23</sup>https://www.quora.com/Whats-the-relative-social-value-of-1-Quora-pageview-as-measured-by-Quora-stats-http-www-quora-com-stats-and-1-Wikipedia-pageview-as-measured-at-say-Wikipedia-article-traffic-statistics/answer/Vipul-Naik

<sup>&</sup>lt;sup>24</sup>http://wikipediaviews.org/

#### And the actual questions:

- 1. How many distinct Wikipedia pages do you read per week on average?
  - less than 1
  - 1 to 10
  - 11 to 25
  - 26 or more
- 2. On a search engine (e.g. Google) results page, do you explicitly seek Wikipedia pages, or do you passively click on Wikipedia pages only if they show up at the top of the results?
  - I explicitly seek Wikipedia pages
  - I have a slight preference for Wikipedia pages
  - I just click on what is at the top of the results
- 3. Do you usually read a particular section of a page or the whole article? (Multiple options can be selected)
  - Particular section
  - Whole page
- 4. How often do you do the following? (Choices: Several times per week, About once per week, About once per month, About once per several months, Never/almost never.)
  - Use the search functionality on Wikipedia
  - Be surprised that there is no Wikipedia page on a topic
- 5. For what fraction of pages you read do you do the following? (Choices: For every page, For most pages, For some pages, For very few pages, Never. These were displayed in a random order for each respondent, but displayed in alphabetical order here.)
  - Check (click or hover over) at least one citation to see where the information comes from on a page you are reading
  - Check how many pageviews a page is getting (on an external site or through the Pageview API)
  - Click through/look for at least one cited source to verify the information on a page you are reading
  - Edit a page you are reading because of grammatical/typographical errors on the page
  - Edit a page you are reading to add new information
  - Look at the "See also" section for additional articles to read
  - Look at the editing history of a page you are reading
  - Look at the editing history solely to see if a particular user wrote the page
  - Look at the talk page of a page you are reading
  - Read a page mostly for the "Criticisms" or "Reception" (or similar) section, to understand different views on the subject

• Share the page with a friend/acquaintance/coworker

For the SurveyMonkey audience, there were also some demographic questions (age, gender, household income, US region, and device type). These questions were not filled by respondents at the time of the survey, but rather, are filled in by respondents in order to be able to participate in these surveys. You can learn more on the SurveyMonkey Contribute page<sup>25</sup>.

### Survey questions for the second SurveyMonkey survey (S2)

For reference, here are the survey questions for the second survey. A dummy/mock-up version of the survey can be found here: https://www.surveymonkey.com/r/28BW78V.

The survey introduction said the following:

This survey is intended to gauge Wikipedia use habits. Please try your best to answer all of the questions, and make a guess if you're not sure.

This survey has 4 questions across 3 pages.

In this survey, "Wikipedia page" refers to a Wikipedia page in any language (not just the English Wikipedia).

#### And the actual questions:

- 1. How many distinct Wikipedia pages do you read (at least one sentence of) per week on average?
  - Fewer than 1
  - 1 to 10
  - 11 to 25
  - 26 or more
- 2. Which of these articles have you read (at least one sentence of) on Wikipedia (select all that apply)? (These were displayed in a random order except the last option for each respondent, but displayed in alphabetical order except the last option here.)
  - Adele
  - Barack Obama
  - Bernie Sanders
  - China
  - Donald Trump
  - Google
  - Hillary Clinton
  - India

 $<sup>^{25}</sup>$ https://contribute.surveymonkey.com/home

- Japan
- Justin Bieber
- Justin Trudeau
- Katy Perry
- Taylor Swift
- The Beatles
- United States
- World War II
- None of the above
- 3. What are some of the Wikipedia articles you have most recently read (at least one sentence of)? Feel free to consult your browser's history.
- 4. Recall a time when you were surprised that a topic did not have a Wikipedia page. What were some of these topics?

As with the SurveyMonkey Audience responses for S1, the responses for S2 also came with demographic information that the respondents had previously filled in.

### Survey questions for the Google Surveys survey (GS)

This survey had exactly one question. The wording of the question was exactly the same as that of the first question of the second survey.

- 1. How many distinct Wikipedia pages do you read (at least one sentence of) per week on average?
  - Fewer than 1
  - 1 to 10
  - 11 to 25
  - 26 or more

One slight difference was that whereas in the second SurveyMonkey survey, the order of the options was fixed, the Google Surveys survey did a 50/50 split between that order and the exact reverse order. Such splitting is a best practice to deal with any order-related biases, while still preserving the logical order of the options. You can read more on the questionnaire design page of the Pew Research Center<sup>26</sup>.

Overall, Google Surveys in the United States is reasonably close to representative of the voting US population and the Internet-using population. For more information on the reliability and validity of Google Surveys responses, you can look at the citations on the Wikipedia page for Google Surveys<sup>27</sup>. Also, the sample size of the survey was largest. Therefore, among the surveys we did,

<sup>&</sup>lt;sup>26</sup>http://www.pewresearch.org/methodology/u-s-survey-research/questionnaire-design/

<sup>&</sup>lt;sup>27</sup>https://en.wikipedia.org/wiki/Google\_Surveys

this survey comes closest to approximating the behavior of the Internet-using population in the United States.

The GS responses come with inferred demographic and geographic data (age, gender, income level, location). The geographic data is generally reliable because it is based on IP address, but inferred age and gender data is not as reliable as the self-reported data that we get from SurveyMonkey Audience. For more on the accuracy of the inferred data, see the Pew Research Center's comparison<sup>28</sup>.

### Survey questions for the New Readers survey (NR)

We will compare the results of our surveys with the results of the New Readers surveys. To shed light on this comparison, we include below the list of questions in the New Readers phone survey.

Not all questions were presented in all surveys. The Egypt survey<sup>29</sup>, which is the more recent, had the longest list of questions, and we provide this list below. The numbering is mostly based on the Egypt survey, though off by one for later questions due to a question missing from the Egypt survey.

- 1. Do you use the Internet?
  - Yes
  - Said no, but uses Facebook
  - No
- 2. What do you use the Internet for the most? (for those who said Yes to Q1)
  - Look up info
  - · Social media
  - Entertainment
  - News
  - Others
- 3. What's the biggest reason you don't use the Internet? (for those who said No to Q1)
  - Too expensive
  - Not sure it's useful
  - Not sure what it is
  - Other
- 4. Have you ever heard of Wikipedia?
  - Yes
  - No

 $<sup>^{28}\</sup>mbox{http://www.people-press.org/2012/11/07/a-comparison-of-results-from-surveys-by-the-pew-research-center-and-google-consumer-surveys/$ 

<sup>&</sup>lt;sup>29</sup>https://meta.wikimedia.org/wiki/Global\_Reach/Egypt\_survey

- 5. Where did you find out about Wikipedia?
  - Internet
  - School
  - Friends and family
  - Radio or TV
  - Not sure
- 6. What do you use Wikipedia for?
  - School
  - Work
  - Entertainment
  - Other
- 7. How often do you use Wikipedia?
  - Daily
  - Weekly
  - Monthly
  - Rarely
  - Never
- 8. How interested are you in reading Wikipedia? (for those who answered "Rarely" or "Never" to the previous question)
  - Not interested
  - Somewhat
  - Very interested
- 9. What's the largest barrier keeping you from reding Wikipedia? (for those who answere "Very interested" to Q8)
  - Don't trust content
  - Expensive data
  - Not interesting enough
  - Can't find it
  - Other
- 10. What would make you more likely to use Wikipedia? (for those who answered "Not interested" to Q8)
  - Trusted the content
  - Cheaper data
  - More interesting articles
  - Known how to find it
  - None
- 11. Do you have a mobile phone? (This question was in some other country surveys though not in the Egypt one. Hence the numbering for later questions is one more than the numbering in the actual Egypt survey)

- Yes
- No
- 12. Can you use the Internet with your phone?
  - Yes
  - No
- 13. How do you access the Internet on your phone?
  - Cellular
  - Wifi and cell
  - Wifi only
  - No Internet
  - Not sure
- 14. What is your usual network speed?
  - 2G / Edge
  - 3G
  - Better than 3G
  - Not sure
- 15. Do you download and use Apps?
  - Yes
  - No
- 16. What is your gender?
  - Male
  - Female
- 17. What is your age?
  - Under 18
  - 19–31
  - 31–50
  - over 50
  - Prefer not to say
- 18. What is your location?
  - Urban
  - Rural
  - Not sure
- 19. What is your geographical zone? (options specific to Egypt)

Our later analysis will focus on the first, fourth, and seventh question, which are together comparable against the first question of S1, S2, and GS.

### **Results**

In this section we present the highlights from each of the survey questions. If you prefer to dig into the data yourself, there are also some exported PDFs below provided by SurveyMonkey. Most of the inferences can be made using these PDFs, but there are some cases where additional filters are needed to deduce certain percentages.

For the SurveyMonkey surveys, we use the notation "SnQm" to mean "survey n question m". The Google Surveys survey question is referred to as GS, and the New Readers questions are referred to with the notation "NRQm" for question m of the survey.

### S1Q1: number of Wikipedia pages read per week

Here is a table that summarizes the data for Q1. Note that SMM and SMF don't add up to SM as some respondents did not specify their gender.

Table 1: How many distinct Wikipedia pages do you read per week on average? SM = SurveyMonkey audience, V = Vipul Naik's timeline, SSC = Slate Star Codex audience, AM = Wikipedia Analytics mailing list, SMM = SurveyMonkey males, SMF = SurveyMonkey females

Response	SM (N=62)	V (N=70)	SSC (N=618)	AM (N=7)	SMM (N=28)	SMF (N=26)
less than 1	42%	1%	1%	0%	25%	58%
1 to 10	45%	40%	37%	29%	46%	42%
11 to 25	13%	43%	36%	14%	29%	0%
26 or more	0%	16%	27%	57%	0%	0%
pgs/wk lower	1.88	9.29	11.35	16.65	3.65	0.42
pgs/wk upper	8.17	19.56	20.81	23.50	12.10	4.70

The "pgs/wk lower" is obtained as the average pages read per week if every-body read at the lower end of their estimate (so the respective estimates are 0, 1, 11, and 26).

The "pgs/wk upper" is obtained as the average of pages read per week if everybody read at the upper end of their estimate, except the "26 or more" case where we assume a value of 30 (so the respective estimates are 1, 10, 25, and 30).

Here are some highlights from the first question that aren't apparent from the table:

• Of the people who read fewer than 1 distinct Wikipedia page per week (26 people), 68% were female even though females were only 48% of the re-

spondents. (Note that gender data is only available for the SurveyMonkey audience.)

• Filtering for high household income (\$150k or more; 11 people) in the SurveyMonkey audience, only 2 read fewer than 1 page per week, although most (7) of the responses still fall in the "1 to 10" category.

The comments indicated that this question was flawed in several ways: we didn't specify which language Wikipedias count nor what it meant to "read" an article (the whole page, a section, or just a sentence?).

One comment questioned the "low" ceiling of 26; in fact, I had initially made the cutoffs 1, 10, 100, 500, and 1000, but Vipul suggested the final cutoffs because he argued they would make it easier for people to answer (without having to look it up in their browser history).

It turned out this modification was reasonable because the "26 or more" group was a minority.

### S1Q2: affinity for Wikipedia in search results

We asked Q2, "On a search engine (e.g. Google) results page, do you explicitly seek Wikipedia pages, or do you passively click on Wikipedia pages only if they show up at the top of the results?", to see to what extent people preferred Wikipedia in search results.

The main implication to this for people who do content creation on Wikipedia is that if people do explicitly seek Wikipedia pages (for whatever reason), it makes sense to give them more of what they want. On the other hand, if people don't prefer Wikipedia, it makes sense to update in favor of diversifying one's content creation efforts while still keeping in mind that raw pageviews indicate that content will be read more if placed on Wikipedia (see for instance Brian Tomasik's experience<sup>30</sup>, which is similar to my own, or gwern's page comparing Wikipedia with other wikis<sup>31</sup>).

The following table summarizes our results. Wikipedia has been shortened to WP to conserve column width.

 $<sup>^{30} \</sup>rm http://reducing-suffering.org/the-value-of-wikipedia-contributions-in-social-sciences/#Readership$ 

<sup>&</sup>lt;sup>31</sup>http://www.gwern.net/Wikipedia%20and%20Other%20Wikis

Table 2: On a search engine (e.g. Google) results page, do you explicitly seek Wikipedia pages, or do you passively click on Wikipedia pages only if they show up at the top of the results? SM = SurveyMonkey audience, V = Vipul Naik's timeline, SSC = Slate Star Codex audience, AM = Wikipedia Analytics mailing list, H = heavy users (26 or more articles per week) of Wikipedia.

Response	SM (N=62)	V (N=70)	SSC (N=618)	AM (N=7)	H (N=179)	SMM (N=28)
Explicitly seek WP	19%	60%	63%	57%	79%	25%
Slight preference for WP	29%	39%	34%	43%	20%	39%
Just click on top results	52%	1%	3%	0%	1%	35%

One error on my part was that I didn't include an option for people who avoided Wikipedia or did something else. This became apparent from the comments. For this reason, the "Just click on top results" options might be inflated. In addition, some comments indicated a mixed strategy of preferring Wikipedia for general overviews while avoiding it for specific inquiries, so allowing multiple selections might have been better for this question.

### S1Q3: section vs whole page

This question is relevant for Vipul and me because the work Vipul funds<sup>32</sup> is mainly whole-page creation. If people are mostly reading the introduction or a particular section like the "Criticisms" or "Reception" section (see S1Q5), then that forces us to consider spending more time on those sections, or to strengthen those sections on weak existing pages.

Responses to this question were fairly consistent across different audiences, as can be see in the following table.

Table 3: Do you usually read a particular section of a page or the whole article? SM = SurveyMonkey audience, V = Vipul Naik's timeline, SSC = Slate Star Codex audience, AM = Wikipedia Analytics mailing list, H = Heavy users (26 or more articles per week) of Wikipedia, SMM = SurveyMonkey male, SMF = SurveyMonkey female.

Response	SM (N=62)	V (N=70)	SSC (N=618)	AM (N=7)	H (N=179)	SMM (N=28)	SMF (N=26)
Section	73%	80%	74%	86%	70%	68%	73%
Whole	34%	23%	33%	29%	37%	39%	31%

<sup>&</sup>lt;sup>32</sup>https://github.com/vipulnaik/contractwork/blob/master/new-article-pool.mediawiki

People were allowed to select more than one option for this question. The comments indicate that several people do a combination, where they read the introductory portion of an article, then narrow down to the section of their interest.

## S1Q4: search functionality on Wikipedia and surprise at lack of Wikipedia pages

We asked about whether people use the search functionality on Wikipedia because we wanted to know more about people's article discovery methods. The data is summarized in the following table.

Table 4: How often do you use the search functionality on Wikipedia? SM = SurveyMonkey audience, V = Vipul Naik's timeline, SSC = Slate Star Codex audience, AM = Wikipedia Analytics mailing list, H = heavy users (26 or more articles per week) of Wikipedia.

Response	SM (N=62)	V (N=69)	SSC (N=613)	AM (N=7)	H (N=176)	SMM (I
Several times per week	8%	14%	32%	57%	55%	14%
About once per week	19%	17%	21%	14%	15%	21%
About once per month	15%	13%	14%	0%	3%	14%
About once per several months	13%	12%	9%	14%	5%	7%
Never/almost never	45%	43%	24%	14%	23%	43%

Many people noted here that rather than using Wikipedia's search functionality, they use Google with "wiki" attached to their query, DuckDuckGo's "!w" expression, or some browser configuration to allow a quick search on Wikipedia.

To be more thorough about discovering people's content discovery methods, we should have asked about other methods as well. We did ask about the "See also" section in S1Q5.

Next, we asked how often people are surprised that there is no Wikipedia page on a topic to gauge to what extent people notice a "gap" between how Wikipedia exists today and how it *could* exist. We were curious about what articles people specifically found missing, so we followed up with S2Q4.

Table 5: How often are you surprised that there is no Wikipedia page on a topic? SM = SurveyMonkey audience, V = Vipul Naik's timeline, SSC = Slate Star Codex audience, AM = Wikipedia Analytics mailing list, H = heavy users (26 or more articles per week) of Wikipedia, SMM = SurveyMonkey males, SMF = SurveyMonkey females.

Response	SM (N=62)	V (N=69)	SSC (N=613)	AM (N=7)	H (N=176)	SMM (I
Several times per week	2%	0%	2%	29%	6%	4%
About once per week	8%	22%	18%	14%	34%	14%
About once per month	18%	36%	34%	29%	31%	18%
About once per several months	21%	22%	27%	0%	19%	29%
Never/almost never	52%	20%	19%	29%	10%	36%

Two comments on this question (out of 59) – both from the SSC group – specifically bemoaned deletionism, with one comment calling deletionism "a cancer killing Wikipedia".

### S1Q5: behavior on pages

This question was intended to gauge how often people perform an action for a specific page; as such, the frequencies are expressed in page-relative terms.

The following table presents the scores for each response, which are weighted by the number of responses. The scores range from 1 (for every page) to 5 (never); in other words, the lower the number, the more frequently one does the thing.

Table 6: For what fraction of pages you read do you do the following? Note that the responses have been shortened here; see the "Survey questions" section for the wording used in the survey. Responses are sorted by the values in the SSC column. SM = SurveyMonkey audience, V = Vipul Naik's timeline, SSC = Slate Star Codex audience, AM = Wikipedia Analytics mailing list, H = heavy users (26 or more articles per week) of Wikipedia, SMM = SurveyMonkey males, SMF = SurveyMonkey females

Response	SM (N=54)	V (N=69)	SSC (N=596)	AM (N=7)	Н
Check $\geq 1$ citation	3.57	2.80	2.91	2.67	2.6
Look at "See also"	3.65	2.93	2.92	2.67	2.7
Read mostly for "Criticisms" or "Reception"	4.35	3.12	3.34	3.83	3.1
Click through $\geq 1$ source to verify information	3.80	3.07	3.47	3.17	3.3
Share the page	4.11	3.72	3.86	3.67	3.7
Look at the talk page	4.31	4.28	4.03	3.00	3.8

Response	SM (N=54)	V (N=69)	SSC (N=596)	AM (N=7)	Н
Look at the editing history	4.35	4.32	4.12	3.33	3.
Edit a page for grammatical/typographical errors	4.50	4.41	4.22	3.67	4.
Edit a page to add new information	4.61	4.55	4.49	3.83	4.
Look at editing history to verify author	4.50	4.65	4.48	3.67	4.
Check how many pageviews a page is getting	4.63	4.88	4.96	3.17	4.

The table above provides a good ranking of how often people perform these actions on pages, but not the distribution information (which would require three dimensions to present fully). In general, the more common actions (scores of 2.5–4) had responses that clustered among "For some pages", "For very few pages", and "Never", while the less common actions (scores above 4) had responses that clustered mainly in "Never".

One comment (out of 43) – from the SSC group, but a different individual from the two in S1Q4 – bemoaned deletionism.

### S2Q1: number of Wikipedia pages read per week

Note the wording changes on this question for the second survey: "less" was changed to "fewer", the clarification "at least one sentence of" was added, and we explicitly allowed any language. We have also presented the survey 1 results for the SurveyMonkey audience in the corresponding rows, but note that because of the change in wording, the correspondence isn't exact.

Table 7: How many distinct Wikipedia pages do you read (at least one sentence of) per week on average? SM = SurveyMonkey audience with no demographic filters, CEYP = College-educated young people of SurveyMonkey, S1SM = SurveyMonkey audience with no demographic filters from the first survey, SMM = SurveyMonkey males, SMF = SurveyMonkey females, CEYPM = College-educated young males of SurveyMonkey, CEYPF = College-educated young females of SurveyMonkey.

Response	SM (N=54)	CEYP (N=50)	S1SM (N=62)	SMM (N=25)	SMF (N=26)	CEYPM (N=24
Fewer than 1	37%	32%	42%	32%	42%	29%
1 to 10	48%	64%	45%	40%	54%	67%
11 to 25	7%	2%	13%	16%	0%	4%
26 or more	7%	2%	0%	12%	4%	0%
pgs/wk lower	3.07	1.38	1.88	5.28	1.58	1.11
pgs/wk upper	9.02	7.82	8.17	11.92	7.02	7.99

The "pgs/wk lower" is obtained as the average pages read per week if every-body read at the lower end of their estimate (so the respective estimates are 0, 1, 11, and 26). The "pgs/wk upper" is obtained as the average of pages read per week if everybody read at the upper end of their estimate, except the "26 or more" case where we assume a value of 30 (so the respective estimates are 1, 10, 25, and 30).

Comparing SM with S1SM, we see that probably because of the wording, the percentages have drifted in the direction of more pages read. It might be surprising that the young educated audience seems to have a smaller fraction of heavy users than the general population. However note that each group only had  $\sim$ 50 responses, and that we have no education information for the SM group.

### S2Q2: multiple-choice of articles read

Our intention with this question was to see if people's stated or recalled article frequencies matched the actual, revealed popularity of the articles. Therefore we present the pageview data<sup>33</sup> along with the percentage of people who said they had read an article.

Table 8: Which of these articles have you read (at least one sentence of) on Wikipedia (select all that apply)? SM = SurveyMonkey audience with no demographic filters, CEYP = College-educated young people of SurveyMonkey. Columns "2016" and "2015" are desktop pageviews in millions. Note that the 2016 pageviews only include pageviews through the end of June. The rows are sorted by the values in the CEYP column followed by those in the SM column.

Response	SM (N=54)	CEYP (N=50)	2016	2015
None	37%	40%	_	_
World War II	17%	22%	2.6	6.5
Barack Obama	17%	20%	3.0	7.7
<b>United States</b>	17%	18%	4.3	9.6
Donald Trump	15%	18%	14.0	6.6
Taylor Swift	9%	18%	1.7	5.3
Bernie Sanders	17%	16%	4.3	3.8
Japan	11%	16%	1.6	3.7
Adele	6%	16%	2.0	4.0
Hillary Clinton	19%	14%	2.8	1.5
China	13%	14%	1.9	5.2
The Beatles	11%	14%	1.4	3.0
Katy Perry	9%	12%	0.8	2.4

<sup>&</sup>lt;sup>33</sup>https://web.archive.org/web/20160714023739/http://wikipediaviews.org/displayviewsformultipleyears.php?tag=Pages%20in%20SurveyMonkey%20second%20survey

Response	SM (N=54)	CEYP (N=50)	2016	2015
Google	15%	10%	3.0	9.0
India	13%	10%	2.4	6.4
Justin Bieber	4%	8%	1.6	3.0
Justin Trudeau	9%	6%	1.1	3.0

Below are four plots of the data. Note that  $r_s$  denotes Spearman's rank correlation coefficient<sup>34</sup>. Spearman's rank correlation coefficient is used instead of Pearson's r because the former is less affected by outliers. Note also that the percentage of respondents who viewed a page counts each respondent once, whereas the number of pageviews does not have this restriction (i.e. duplicate pageviews count), so we wouldn't expect the relationship to be entirely linear even if the survey audiences were perfectly representative of the general population.

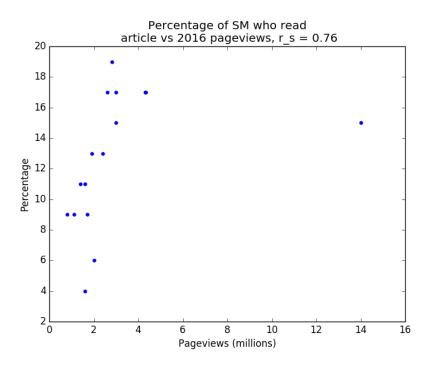


Figure 1: SM vs 2016 pageviews

 $<sup>^{34}</sup> https://en.wikipedia.org/wiki/Spearman\%27s\_rank\_correlation\_coefficient$ 

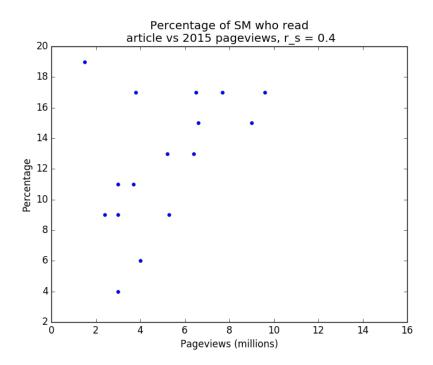


Figure 2: SM vs 2015 pageviews

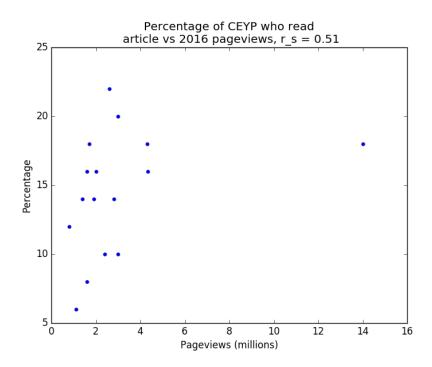


Figure 3: CEYP vs 2016 pageviews

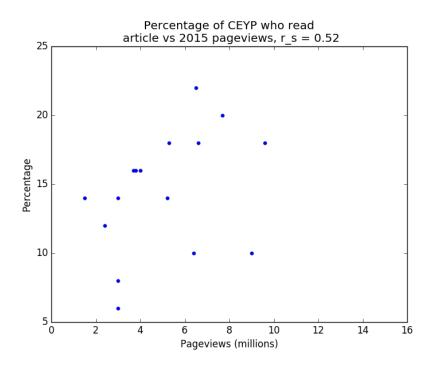


Figure 4: CEYP vs 2015 pageviews

### S2Q3: free response of articles read

The most common response was along the lines of "None", "I don't know", "I don't remember", or similar. Among the more useful responses were:

- News stories (e.g. Death of Harambe<sup>35</sup>, "WikiLeaks scandal" unclear which page this is, since there are several pages on various aspects of WikiLeaks)
- Popular culture:
  - People including Megan Fox<sup>36</sup>, LeBron James<sup>37</sup>, Rita Hayworth<sup>38</sup>
  - Works including Aladdin and the King of Thieves<sup>39</sup>, X-Men: Apocalypse<sup>40</sup>
- More traditional encyclopedic information (e.g. Emerald ash borer<sup>41</sup>, Spain<sup>42</sup>, Siphonophorae<sup>43</sup>, Scolopendra gigantea<sup>44</sup>)

### S2Q4: free response of surprise at lack of Wikipedia pages

As with the previous question, the most common response was along the lines of "None", "I don't know", "I don't remember", "Doesn't happen", or similar.

The most useful responses were classes of things: "particular words", "French plays/books", "Random people", "obscure people", "Specific list pages of movie genres", "Foreign actors", "various insect pages", and so forth.

### **GS** (Google Surveys)

The survey was circulated to a target size of 500 in the United States (no demographic filters), and received 501 responses. The acquisition cost was \$50 (10 cents per response).

Since there was only one question, but we obtained data filtered by demographics in many different ways, we present this table with the columns denoting responses and the rows denoting the audience segments.

We also include the S1Q1SM, S2Q1SM, and S2Q1CEYP responses for easy comparison. Note that S1Q1SM did not include the "at least one sentence

 $<sup>^{35}</sup> https://en.wikipedia.org/wiki/Death\_of\_Harambe$ 

<sup>&</sup>lt;sup>36</sup>https://en.wikipedia.org/wiki/Megan\_Fox

<sup>&</sup>lt;sup>37</sup>https://en.wikipedia.org/wiki/LeBron\_James

<sup>&</sup>lt;sup>38</sup>https://en.wikipedia.org/wiki/Rita\_Hayworth

<sup>&</sup>lt;sup>39</sup>https://en.wikipedia.org/wiki/Aladdin\_and\_the\_King\_of\_Thieves

<sup>&</sup>lt;sup>40</sup>https://en.wikipedia.org/wiki/X-Men:\_Apocalypse

<sup>&</sup>lt;sup>41</sup>https://en.wikipedia.org/wiki/Emerald\_ash\_borer

<sup>&</sup>lt;sup>42</sup>https://en.wikipedia.org/wiki/Spain

<sup>&</sup>lt;sup>43</sup>https://en.wikipedia.org/wiki/Siphonophorae

<sup>44</sup>https://en.wikipedia.org/wiki/Scolopendra\_gigantea

of" caveat. We believe that adding this caveat would push people's estimates upward.

If you view the Google Surveys results online<sup>45</sup> you will also see the 95% confidence intervals for each of the segments. Note that percentages in a row may not add up to 100% due to rounding or due to people entering "Other" responses. For the entire GS audience, every pair of options had a statistically significant difference, but for some subsegments, this was not true.

Audience segment	Fewer than 1	1 to 10	11 to 25	26 or more	pgs/wk range
S1Q1SM (N=62)	42%	45%	13%	0%	1.88-8.17
S1Q1SMM (N=28)	25%	46%	29%	0%	3.65-12.10
S1Q1SMF (N=26)	58%	42%	0%	0%	0.42 - 4.70
S2Q1SM (N=54)	37%	48%	7%	7%	3.07-9.02
S2Q1SMM (N=25)	32%	40%	16%	12%	5.28-11.92
S2Q1SMF (N=26)	42%	54%	0%	4%	1.58-7.02
S2Q1CEYP (N=50)	32%	64%	2%	2%	1.38-7.82
S2Q1CEYPM (N=24)	29%	67%	4%	0%	1.11-7.99
S2Q1CEYPF (N=26)	35%	62%	0%	4%	1.66-7.75
GS all (N=501)	47%	35%	12%	6%	3.23-8.53
GS male (N=205)	41%	38%	16%	5%	3.44-9.71
GS female (N=208)	52%	34%	10%	5%	2.74-7.92
GS 18-24 (N=54)	33%	46%	13%	7%	3.71-10.28
GS 25-34 (N=71)	41%	37%	16%	7%	3.95-10.21
GS 35-44 (N=69)	51%	35%	10%	4%	2.49-7.71
GS 45-54 (N=77)	46%	40%	12%	3%	2.50-8.36
GS 55-64 (N=69)	57%	32%	7%	4%	2.13-6.72
GS 65+ (N=50)	52%	24%	18%	4%	3.26-8.62
GS Urban (N=176)	44%	35%	14%	7%	3.71-9.54
GS Suburban (N=224)	50%	34%	10%	6%	3.00-8.20
GS Rural (N=86)	44%	35%	14%	6%	3.45-9.24
GS \$0-24K (N=49)	41%	37%	16%	6%	3.69-9.91
GS \$25-49K (N=253)	53%	30%	10%	6%	2.96-7.83
GS \$50-74K (N=132)	42%	39%	13%	6%	3.38-9.37
GS \$75-99K (N=37)	43%	35%	11%	11%	4.42-9.98
GS \$100-149K (N=11)	9%	64%	18%	9%	4.78-13.69
GS \$150K+ (N=4)	25%	75%	0%	0%	0.75–7.75

The "pgs/wk range" is obtained as follows. The lower bound is obtained as the average pages read per week if everybody read at the lower end of their estimate (so the respective estimates are 0, 1, 11, and 26). The upper bound is obtained as the average of pages read per week if everybody read at the upper

 $<sup>^{45}</sup> https://www.google.com/insights/consumersurveys/view?survey=o3iworx2rcfixmn2x5shtlppci&question=1&filter=&rw=1$ 

end of their estimate, except the "26 or more" case where we assume a value of 30 (so the respective estimates are 1, 10, 25, and 30).

We can see that the overall GS data vindicates the broad conclusions we drew from SurveyMonkey data. Moreover, most GS segments with a sufficiently large number of responses (50 or more) display a similar trend as the overall data. One exception is that younger audiences seem to be slightly less likely to use Wikipedia very little (i.e. fall in the "Fewer than 1" category), and older audiences seem slightly more likely to use Wikipedia very little.

## Data validation using known total United States Wikipedia pageviews

Using the country breakdown data<sup>46</sup> for traffic to Wikipedia, we see that Wikipedia received 3.54 billion views in the United States for a recent 30-day period, which translates to about 827 million weekly pageviews.

Estimates for the number of active Internet users in the United States vary, based on definition, between 150 million and 290 million. With these estimates, we get a range of 2.85–5.51 for the number of pageviews per week for a United States user. We see that this range is loosely within the range for the SurveyMonkey surveys as well as Google Surveys. In other words, the survey data is loosely plausible and consistent with known facts.

## NRQ1: Do you use the Internet? and NRQ4: Have you ever heard of Wikipedia?

Both questions were asked in the New Readers phone survey for all five countries. NRQ1 was the same across all countries (though for Egypt, the "No" responses were further split to separate people who used Facebook). NRQ4 was asked as Q3 in Nigeria, Mexico, and Brazil.

The response distribution is below. We also compute and report the ratio of the Yes responses to NRQ4 and NRQ1, as this gives an estimate of the percentage of Internet users who have heard of Wikipedia. With that said, it's not necessary that everybody who answered Yes to NRQ4 answered Yes to NRQ1; there could be people who don't use the Internet but have heard of Wikipedia. Still, it gives an approximate sense.

Country	NRQ4 Yes	NRQ1 Yes	Ratio
Nigeria (N=2768)	23%	65%	35%
India (N=9235)	25%	64%	39%

 $<sup>^{46}</sup> https://stats.wikimedia.org/wikimedia/squids/SquidReportPageViewsPerCountryBreakdownHuge.htm$ 

Country	NRQ4 Yes	NRQ1 Yes	Ratio
Mexico (N=2568)	45%	80%	56%
Brazil (N=5343)	32%	77%	42%
Egypt (N=3976)	17%	59%	29%

An interesting note of comparison: for the surveys we circulated, we did not even ask people if they had heard of Wikipedia. The implicit assumption was that people had heard of Wikipedia. This assumption was probably reasonable in the contexts we operated in,and it didn't make sense to waste a question (and the underlying survey costs) on getting that information.

### NRQ7: How often do you use Wikipedia?

This question was in all country surveys, though at different positions.

The respondents to this question appear to have been selected as only the ones who had heard of Wikipedia.

Country	Daily	Weekly	Monthly	Rarely	Never	pgs/wk range
Nigeria (N=610)	20%	24%	15%	17%	24%	1.07-2.80
India (N=2270)	22%	26%	16%	20%	16%	1.17-3.06
Mexico (N=1169)	18%	33%	19%	17%	14%	1.09 - 2.89
Brazil (N=1736)	13%	33%	23%	20%	11%	0.89 - 2.41
Egypt (N=665)	11%	23%	23%	24%	19%	0.72–1.91

The pgs/wk range is calculated as follows. For monthly use, we assume between 0.2 and 0.5 views a week. For weekly use, we assume between 1 and 3 views a week. For daily use, we assume between 4 and 10 views a week.

We also calculate the percentages relative to the set of all survey respondents (so that the denominator now includes people who have never heard of Wikipedia) and add all the ones who didn't respond to the Never column:

Country	Daily	Weekly	Monthly	Rarely	Never	pgs/wk range
Nigeria (N=2768)	4.4%	5.3%	3.3%	3.7%	83.3%	0.24-0.62
India (N=9235)	5.4%	6.4%	3.9%	4.9%	79.3%	0.29 - 0.75
Mexico (N=2568)	8.2%	15.0%	8.7%	7.7%	61.0%	0.50 - 1.31
Brazil (N=5343)	4.2%	10.7%	7.5%	6.5%	71.1%	0.29 - 0.78
Egypt (N=3976)	1.8%	3.8%	3.8%	4.0%	86.5%	0.12-0.31

Next, we do the same calculation, but now use our denominator as the number

of people who use the Internet. This is the closest in spirit to the audience for SurveyMonkey Audience and Google Surveys in the United States, though the selection dynamic does differ quite a bit.

Country	Daily	Weekly	Monthly	Rarely	Never	pgs/wk range
Nigeria	7.1%	8.5%	5.3%	6.0%	73.1%	0.38-0.99
India	8.6%	10.2%	6.3%	7.8%	67.3%	0.46 - 1.20
Mexico	10.1%	18.6%	10.7%	9.6%	51.6%	0.61 - 1.62
Brazil	5.4%	13.7%	9.6%	8.3%	63.0%	0.37 - 1.00
Egypt	3.2%	6.6%	6.6%	6.9%	76.7%	0.21-0.55

### Comparison against United States audiences

This question can be compared with S1Q1, S2Q1, and GS. However, the buckets presented to users were very different. The potential correspondence is below.

- 1. How many distinct Wikipedia pages do you read (at least one sentence of) per week on average?
  - Fewer than 1: This corresponds to Monthly, Rarely, and Never.
  - 1 to 10: This corresponds to Weekly and a subset of Daily.
  - 11 to 25: This mostly corresponds to Daily.
  - 26 or more: This mostly corresponds to Daily.

The data show that the people surveyed read Wikipedia less than the Survey-Monkey Audience and Google Surveys audiences. The total of the Monthly, Rarely, and Never columns for each of the five countries is over 70%, and it is over 80% for all countries other than Mexico. The corresponding "Fewer than 1" percentage for each iteration of urveyMonkey Audience and Google Surveys is less than 50%, and even on subsegments it is less than 60%.

In other words, the surveys suggest that Wikipedia use is less in the five countries than in the United States.

### Data validation against known total country traffic

We get the estimate for weekly traffic by scaling from 30 days to 7 days the country breakdown data<sup>47</sup>.

We get Internet-using population estimates from the Wikipedia page<sup>48</sup>, which in turn relies on Internet Live Stats. Estimates were captured on December 23, 2016.

 $<sup>^{47}</sup> https://stats.wikimedia.org/wikimedia/squids/SquidReportPageViewsPerCountryBreakdownHuge. htm$ 

<sup>&</sup>lt;sup>48</sup>https://en.wikipedia.org/wiki/List\_of\_countries\_by\_number\_of\_Internet\_users

Internet user and weekly pageview counts are in the millions. The range is the one computed based on the Internet-using population.

We see that the pgs/wk number is a little lower than the range for the case of Nigeria and India, with the gap particularly huge in Nigeria. Otherwise, however, the ranges are plausible and so the pageview data loosely validates the survey results.

Country	Internet users	Weekly pageviews	pgs/wk	pgs/wk range
Nigeria	86.2	7.88	0.09	0.38-0.99
India	462.1	127.20	0.28	0.46 - 1.20
Mexico	68.3	71.01	1.04	0.61 - 1.62
Brazil	120.1	71.77	0.59	0.37 - 1.00
Egypt	42.3	9.59	0.23	0.21-0.55

Based on the above numbers (127 million pageviews from 462 million users), we obtain 0.27 pageviews per week from each user. The surveyed users appear to use Wikipedia much more.

# Takeaway: Huge gap between heavy users and general US audience, plus predictors of heavy use

The most striking finding to us was just how wide the gap is between audiences such as Vipul's Facebook friends and Slate Star Codex on the one hand, and general US Internet users (as measured through SurveyMonkey Audience and Google Surveys) on the other.

### Confirming the gap with numbers

Here's three different ways to slice the data to confirm the gap between the audiences.

- Percentage of respondents who view less than 1 Wikipedia page per week: For Vipul's friends, Slate Star Codex, and the Analytics mailing list, this was 0% or 1%. In contrast, for all the SurveyMonkey Audience and Google Surveys segments considered, this was 25% or higher, with the most general US audiences and largest sample sizes giving numbers between 40% and 60%.
- Estimated pages/week range: For Vipul's friends, Slate Star Codex, and the Analytics mailing list, the lower end was 9 or higher, and the upper end was 19 or higher. In contrast, for all the SurveyMonkey Audience and

Google Surveys segments considered, the lower end was less than 5 nd the upper end was less than 15.

 Percentage of respondents who view 26 or more Wikipedia pages per week: For Vipul's friends, Slate Star Codex, and the Analytics mailing list, the number was 16%, 27%, and 57% respectively. In contrast, for all the SurveyMonkey Audience and Google Surveys segments, this percentage was less than 13%, and for most of the larger segments it was less than 7%.

## Qualitative differences in other aspects of Wikipedia engagement

Through the additional questions in S1, we got evidence for these statements, true both for heavy users, and for audiences that have a larger proportion of heavy users:

- They tend to explicitly seek Wikipedia in search results (S1Q2).
- They are more likely to be surprised at the absence of a Wikipedia page (S1Q4).
- They are more likely to use the search functionality within Wikipedia (S1Q4).
- They are considerably more likely to engage with page content in various ways, including looking at the See Also section, sharing the page, focusing on Criticisms and Reception, checking citations, and checking the talk page (S1Q5).

#### However:

- They are not too different from the general US audience in terms of the extent to which they read a section versus the whole page (S1Q3).
- They are not noticeably more likely to engage in editing actions on Wikipedia (in other words, active Wikipedia editors constituted a small fraction of heavy users) (S1Q5).

### Predictors of audiences with high proportions of heavy users

Of the three audiences with a high proportion of heavy Wikipedia users: Vipul's Facebook friends, Slate Star Codex, and the Wikimedia Analytics mailing list, only the third has an obvious connection with Wikipedia. The first two audiences are not directly linked to Wikipedia, and this is evidenced somewhat by the low rate of Wikipedia editing in these audiences. This suggests that visiting a specific website or being in a specific friend group on social media can be good predictors of heavy Wikipedia use.

We don't know what sort of other websites predict heavy Wikipedia use. Websites similar to Slate Star Codex are obvious candidates, so for instance, Less-Wrong, Wait But Why, and XKCD might qualify. This is an area where further exploration can reveal a lot.

## Takeaway: Effect on impact estimates for pageviews

As described in the Motivation section, our interest in the topic stems partly from a desire to quantify the value of individual Wikipedia pageviews. The results we obtained caused us to revise our estimate upward, but with the important caveat of downgrading the reach of Wikipedia.

### Upgrading estimate of impact based on reader quality

For some pages, the main way it is impactful is if the right set of people read it. For such a page, getting 1,000 pageviews from the right people (the ones with the information, authority, and skill to act on it) is more valuable than getting 1,000 pageviews from people who happen to visit the page accidentally.

The qualities we have identified for heavy Wikipedia users around their explicit seeking of Wikipedia as well as their use of advanced features on Wikipedia to verify facts and learn more, give us a little more confidence that pages are being read by the right people who are equipped to take action on them.

Additionally, other information we have about the audiences with high proportions of heavy users (specifically, that they are friends with Vipul, read Slate Star Codex, or are on the Analytics mailing list) also give us reason to be optimistic about these readers relative to general Internet users.

### Downgrading estimate of impact through reach

For some pages, the most plausible path to impact could be through wide reach.

For such a page, getting 1 million pageviews from 1 million distinct users, spread diversely across socio-economic strata and geographies, is more valuable than getting 1 million pageviews through a hundred thousand users who visit the page repeatedly because they like to get information on facts.

The fact that most people read Wikipedia very little puts a serious dampener on this sort of impact pathway.

# Takeaway: Comparison with demographic gaps in the US and worldwide

#### Gender within the United States

For S1, S2, and GS, males in the general US audience used Wikipedia a bit more than females in the general US audience. The biggest and clearest gap was in the percentage of people who view less than 1 Wikipedia page. The gaps were as follows:

- S1Q1: 25% of males and 58% of females view less than 1 Wikipedia page per week.
- S2Q1: 32% of males and 42% of females view fewer than 1 Wikipedia page per week.
- GS: 41% of males and 52% of females view fewer than 1 Wikipedia page per week.

The gaps at the higher end of pages/week were less statistically robust because the percentages were too small, and therefore easily affected by outlier individuals. With that said, the overall pages/week ranges for men were mostly higher than those for women, as expected.

The gender gap is consistent with past research on gender differences in Wikipedia reading<sup>49</sup>.

Note, however, that people talking of Wikipedia's gender gap are usually referring to a gender gap in Wikipedia editing, and the two gender gaps are both conceptually different and very different in magnitude (the gender gap in editing is much stronger than the gender gap in reading).

The gender gap in reading is small compared to the difference with Vipul's Facebook friends, Slate Star Codex, and the Analytics Mailing List, all of which had 0% or 1% of people viewing less than 1 Wikipedia page per week.

Unfortunately, for the three audiences (Vipul's Facebook friends, Slate Star Codex, and the Analytics mailing list), we do not have gender data for individual respondents. The audiences from which the respondents were drawn are between 60% and 80% male, but it's plausible that the actual respondents had a gender proportion outside this range.

### Age within the United States

For S1 and S2, the number of people within each age bucket was too small to draw any conclusion. We did notice that on S2, older people were less likely

<sup>&</sup>lt;sup>49</sup>http://www.sciencedirect.com/science/article/pii/S0740818810000356

to enter optional comments, but we don't know why (it could be because of greater difficulty typing rather than anything specific to Wikipedia).

For GS, we saw a clear age gradient. In particular, older pepole were more likely to select the "Fewer than 1" option for the number of Wikipedia pages they read per week. Here's a snippet from the Google Surveys results table showing that:

Audience segment	Fewer than 1
GS 18–24 (N=54)	33%
GS 25-34 (N=71)	41%
GS 35-44 (N=69)	51%
GS 45-54 (N=77)	46%
GS 55-64 (N=69)	57%
GS 65+ (N=50)	52%

These age differences pale in comparison with the differences with Vipul's Facebook friends, Slate Star Codex, and the Analytics mailing list, all of which had 1% or less of their users viewing fewer than 1 page per week.

Unfortunately, for the three audiences (Vipul's Facebook friends, Slate Star Codex, and the Analytics mailing list), we do not have age data for individual respondents. The audiences from which the respondents were drawn are mostly in the 18–24, 25–34, and 35–44 age groups.

### Cross-country comparison in perspective

Here's an ordering by Wikipedia use:

Low-income countries (India, Nigeria, Brazil, Egypt) < Mexico < United States < Audiences such as Vipul's Facebook friends, Slate Star Codex, Analytics mailing list < Heavy users

Here are the estimates:

- Low-income countries: 0.05 to 0.6 pages/week per Internet user
- Mexico: Around 1 page/week per Internet user
- United States: Between 2.85 and 5.51 pages/week per Internet user
- Vipul's Facebook friends and Slate Star Codex: Between 9 and 21 pages/week per Internet user
- Heavy users: At least 26 pages/week per Internet user.

Thus, we see that the gap from the United States average to a heavy user is about the same as the gap from a low-income country to the United States.

Here's another way of thinking about it. Wikipedia as a whole got about 16 billion pageviews over a recent 30-day period. If Internet users everywhere

used it as much as they do in the United States (even at current Internet penetration rates) Wikipedia would get around double that many pageviews, or about 32 billion a month. If Internet users everywhere used Wikipedia as much as Slate Star Codex readers, Wikipedia would get between 150 billion and 300 billion pageviews a month (a number comparable to the total number of Google searches performed worldwide). If everybody in the world had Internet connectivity and used Wikipedia as much as Slate Star Codex readers do, Wikipedia would get between 400 billion and 800 billion monthly pageviews.

### Survey-making lessons

Not having any experience designing surveys, and wanting some rough results quickly, I decided not to look into survey-making best practices beyond the feedback from Vipul. As the first survey progressed, it became clear that there were several deficiencies in that survey:

- Question 1 did not specify what counts as reading a page.
- We did not specify which language Wikipedias we were considering (multiple people noted how they read other language Wikipedias other than the English Wikipedia).
- Question 2 did not include an option for people who avoid Wikipedia or do something else entirely.
- We did not include an option to allow people to release their survey results.

## **Further questions**

The two surveys we've done so far provide some insight into how people use Wikipedia, but we are still far from understanding the value of Wikipedia pageviews. Some remaining questions:

- Could it be possible that even on non-obscure topics, most of the views are by "elites" (i.e. those with outsized impact on the world)? This could mean pageviews are more valuable than previously thought.
- On S2Q1, why did our data show that CEYP was less engaged with Wikipedia than SM? Is this a limitation of the small number of responses or of SurveyMonkey's audiences?

## **Further reading**

- "The great decline in Wikipedia pageviews (condensed version)" by Vipul Naik
- "In Defense Of Inclusionism"<sup>51</sup> by gwern

# Summaries of responses (exports for SurveyMonkey, weblink for Google Surveys)

SurveyMonkey allows exporting of response summaries. Here are the exports for each of the audiences.

- Survey 1, SurveyMonkey's audience<sup>52</sup>
- Survey 1, Vipul's timeline<sup>53</sup>
- Survey 1, Wikipedia Analytics mailing list<sup>54</sup>
- Survey 1, Slate Star Codex<sup>55</sup>
- Survey 1, Heavy users<sup>56</sup>
- Survey 2, no demographic filters<sup>57</sup>
- Survey 2, educated young people<sup>58</sup>

The Google Surveys survey results are available online at https://www.google.com/insights/consumersurveys/view?survey=o3iworx2rcfixmn2x5shtlppci&question=1&filter=&rw=1.

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 $<sup>^{50}</sup> http://lesswrong.com/lw/lxc/the\_great\_decline\_in\_wikipedia\_pageviews/$ 

 $<sup>^{51}</sup> http://www.gwern.net/In\%20Defense\%20Of\%20Inclusionism$ 

<sup>&</sup>lt;sup>52</sup>http://files.issarice.com/SurveyMonkey.pdf

<sup>&</sup>lt;sup>53</sup>http://files.issarice.com/Vipul\_timeline.pdf

<sup>&</sup>lt;sup>54</sup>http://files.issarice.com/Wikipedia\_analytics\_mailing\_list.pdf

<sup>&</sup>lt;sup>55</sup>http://files.issarice.com/Slate\_Star\_Codex.pdf

 $<sup>^{56}</sup> http://files.issarice.com/Heavy\_users.pdf$ 

<sup>&</sup>lt;sup>57</sup>http://files.issarice.com/S2\_unfiltered.pdf

<sup>&</sup>lt;sup>58</sup>http://files.issarice.com/S2\_educated.pdf

<sup>&</sup>lt;sup>59</sup>http://vipulnaik.com/

<sup>&</sup>lt;sup>60</sup>https://www.facebook.com/ethan.bashkansky

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### **Survey cost**

The survey response collection cost was \$325, broken down as follows:

- S1, to SurveyMonkey Audience: \$100, for 50 responses at \$2 per response
- S2, to SurveyMonkey Audience: \$50, for 50 responses at \$1 per response
- S2, to SurveyMonkey Audience with filters (college-educated, age 18–29): \$125, for 50 responses at \$1.25 per response
- GS (Google Surveys): \$50, for 500 responses at 10 cents per response

### Document source and versions

The source files used to compile this document are available in a GitHub Gist<sup>62</sup>. The Git repository of the Gist contains all versions of this document since its first publication.

Here is a list of major versions of this document:

- 2016-07-14: Initial public version.
- 2016-08-27: A summary is added to the top of the post.
- 2016-10-05: Google Surveys (then Google Consumer Surveys) results are added.

This document is available in the following formats:

- As an HTML file at http://lesswrong.com/r/discussion/lw/nru/wikipedia\_usage\_survey\_results/
- As a PDF file at http://files.issarice.com/wikipedia-survey-results.pdf

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 $<sup>^{61}</sup> https://github.com/vipulnaik/working-drafts/blob/master/contributor-lists/issalist.mediawiki#Nonpage_payments$ 

<sup>62</sup>https://gist.github.com/riceissa/7296b85303f96f2dc1dfb4f9a8ea44d9

<sup>&</sup>lt;sup>63</sup>https://creativecommons.org/publicdomain/zero/1.0/