#### **Doctoral thesis**

## Temporal and behavioral patterns in the use of Wikipedia

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# GSyC

#### http://gsyc.es/~ajreinoso/phdthesis http://gsyc.es/~ajreinoso/phdthesis/slides.pdf

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Introduction

Research objectives, Motivation and Contributions

State of the art

Methodology

Results

Further work

Questions

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Some relevant features:

- Wikipedia is probably the most successful wiki-based platform.
- Wikipedia represents a new form of free management and distribution of knowledge.
- It is being built with the collaborative efforts of thousands of volunteers.
- Wikipedia is not supported by any well-known authority.



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#### **Introduction.** The Wikipedia project

#### Wikipedia in figures:

- 282 editions (languages)
- By 19 million and a half articles
- By 83,000 active editors
- More than 30 million registered users



http://meta.wikimedia.org/wiki/List\_of\_Wikipedias#Grand\_Total

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#### **Introduction.** The Wikipedia project

The Wikipedia's audience places its web site within the top-seven most visited pages all over the Internet (Alexa)<sup>1</sup>

site statistics	audience profiles	🚆 subdomains (100)		
Unique Visitors	Compare Second Metric 🛛 🔻			
7D 30D 3M 6M 1Y 2Y		🟠 Save Graph Image 🛛 📓 Export CS\	/ 📓 Embed Graph 🥻 Permalink	
wikipedia.org			Unique Visitors	
85M				
80M		$\checkmark$		
75M				

- Near 453 million pageviews a day (about 13,500 million a month)<sup>2</sup>
- By 85 million unique visitors in USA during May, 2011 (Compete)<sup>3</sup>

<sup>1</sup>http://www.alexa.com/siteinfo/wikipedia.org <sup>2</sup>http://stats.wikimedia.org/EN/Sitemap.htm <sup>3</sup>http://siteanalytics.compete.com/wikipedia.org/?metric=uv

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#### Introduction. The Wikipedia project.

This relevance has made Wikipedia to became a subject of research regarding...

- Its dimension as a mass phenomenon.
- The concern with the quality and reliability of its contents.
- The evolution and growth tendency of such kind of project.

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#### **Research objectives**

We are interested in the way in which users interact, communicate and make use of Wikipedia. So...

How do users utilize Wikipedia?

What do users use Wikipedia for?

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In detail...

- How do people use Wikipedia ?
  - Traffic characterization: Types and frequencies of users' interactions with Wikipedia
  - Temporal patterns.
  - Behavioral patterns.

What do people use Wikipedia for?

Contents that attract users' attention in visits and edits

Topics involved in search operations

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#### **Motivation**

Why?

- Few studies addressing the use of Wikipedia by its users.
- Available data feed (Openness principles).
- Use of an innovative approach based on the analysis of the traffic (previous ones were based on dumps files).
- Validation: Possibility of comparing some of our results with similar ones from other sources.
- Sociological aspects derived from temporal and behavioral patterns.
- Easy reproducibility of the analysis.

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#### What for ?

## So, what for ?

- Precise traffic characterization may lead to improvements in the systems in charge of managing users' requests.
- Time models may permit to forecast the evolution of users' requests.
- To quantify the degree of collaboration exhibited by some communities.
- To determine the origin of contributions to Wikipedia: elite of authors vs. general visitors.

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Focusing on raw traffic...

- Validation of log analysis: Can we trust the results obtained from the analysis of traffic containing users' requests?
- Detailed characterization of user's requests: Can we determine the exact composition of the traffic to Wikipedia?
- Traffic-size relationship: Is there any relationship between the traffic to each Wikipedia edition and its size?

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Focusing on users' requests...

- Temporal patterns: Do the different kinds of requests present cyclical evolutions over time (periodicity)?
- Behavioral aspects: Are the users' requests the reflect of different kind of behaviors when browsing Wikipedia?
- Degree of users' participation and reluctance: Can we establish the degree of participation and collaboration of the different communities of users?

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Focusing on contents...

- Audience of featured contents. Does the promotion of high quality articles to a featured status have an impact on the traffic they attract?
- Popular contents: What kind of contents are the most visited and contributed in each Wikipedia edition?
- Search operations : What are the topics more frequently involved in search operations? How do search operations influence visits related to the same contents?

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#### State of the art. Wikipedia research

From farther to closer approaches:

- Communities and generation of knowledge.
  - Surowiecki's "The wisdom of the crowds" [Sur04]
  - Stalder and Hirsh "Open intelligence" [SH02]
- The wikis and Wikipedia as research topics.
  - Wikis to involve users in the process of generation of knowledge. Ebersbach [EG04] [EG05]
  - Quality: Analysis of credibility by Korfiatis [KNP+06] and Chesney [Che06]. Comparison approach by Giles [Gil05] and Luyt [LKSY07]
  - Author reputation: Adler y Alfaro [Ada07] analyzed longevity of editions.
  - Evolution: Buriol's Wikigraph [BCD+06]
  - Featured articles: Viegas [VWM07]
  - Consensus and vandalism: Priedhorsky [PCS+07]

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#### State of the art. Wikipedia research

- Analysis based on logged information.
  - Web servers. Arlitt & Williamson [AW96] [AW97]
  - Squids: Khunkitti [KI01]
- Use of wikis and Wikipedia

#### Academic research

- Wiki-based networks: SNA and DNA by Müller [MMB08]
- Surveys on academic environments: Head and Heisenberg [HE10], Schweitzer [Sch08]
- Contributions: long-tail dist. Kittur [KPSM07] Chi [Chi07]
- Most popular topics: Spoerry [Spo07]
- WMF servers' workload: Urdaneta [UPvS07b]
- Authoring, coordination and survival of contributions: Ortega [OGB07] [Ort09]

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#### State of the art. Wikipedia research

#### **Non-Academic research**

- Quantitative information: WMF itself, Mituzas's pageviews and Zachte's portal.
- Several visualizations of Mituza's logs but most of them unmaintained and not-updated.
- External sources: Alexa or ComScore.



🗋 peak 📓 images 📓 pmtpa 📓 esams-ing 📓 esams

0 current,

Client requests/s

Backend requests/s: MediaWiki (0 current) Images (0 current)

55177 average,



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84404 maximum Thu Nov 4 18:06:01 2010

Basic idea: To analyze the users' requests submitted to Wikipedia in order to:

- Perform a characterization of the whole traffic.
- Filter and store the information elements of the ones considered of interest for the analysis.

In the following:

- The Wikipedia hardware architecture.
- Description of the data feed.
- Processing users' requests: The ad-hoc developed WikiSquilter application.

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#### Methodology. The Wikimedia Foundation server architecture



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#### Methodology. The Wikimedia Foundation server architecture

Squid servers:

- Usually work as proxy servers .
- May also work as reverse proxies caching contents previously requested to reply to new demands.
- Working in this way, Squids avoid the operation of both database and web servers placed behind them.
- WMF Squids deal with all the traffic to all its projects.
- After having sent a response, Squids register the corresponding user's URL demanding it.
- Every Squid send its lines to a central aggregator from where we receive them: **heterogeneity**.

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#### Methodology. The WMF Squid log format

Squids register different information about users' requests according to their log format: Field Received

Squid hierarchy status
MIME content type
Referrer header
User-Agent header

Sequence number: allows to detect packet losses.

Save field: Indicates whether a request caused a write operation.

Users' privacy is always preserved: logs are anonymized

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Squid Hostname

**Request method** 

**GMT** Time

headers

URI

Sequence number

Request service time (ms.)

**Reply size including HTTP** 

 $\sqrt{}$ 

 $\sqrt{}$ 

 $\sqrt{}$ 

 $\sqrt{}$ 

 $\sqrt{}$ 

#### Methodology. The WMF Squid log format

May 6 13:46:04 208.80.152.138 22260437
2010-05-06T13:42:43.827
http://en.wikipedia.org/wiki/April - 2 GET

Most important fields

- Squid datetime
- URL specifying a user request.
- Field indicating a save operation (save) or a read one (-)

Received Squid lines are stored in a file which is daily rotated. In average, each of these files contain 40M lines and are about 900 MB.

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#### Methodology. The data feed in detail

Our data feed consists in Squid log lines corresponding to users' requests:

1/100 sample of the whole traffic directed to all the WFM projects during 2009 (15,000 million log lines)

Our analysis focuses on:

- The ten largest (articles and traffic volume) Wikipedia editions: DE, EN, ES, FR, IT, JA, NL, PL, PT, RU.
- Some specific namespaces: Main, Talk, User, User\_Talk and Special.
- Most commonly requested actions: read, edit, submit, history, save and search.

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#### Articles visited for reading are in the Main namespace:



#### http://en.wikipedia.org/wiki/Squid

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The **Discussion** namespace gathers information devoted to improve the quality of the article or to broaden its contents.

1 11 N	Discussion			Head Ear Hew Section Vie		
Winner	Talk:S	ssion about the content page [alt-t]				
WIKIPEDIA The Free Encyclopedia	From Wikipedia, the	e free encyclopedia				
Main naga		This is the	talk page for discussing improve	nents to the Squid article.		
Contents		• This is not a forum for general discussion	on of the article's subject.	Be polite	Article policies	
Featured content		• Put new text under old text. Click here t	o start a new topic.	Assume good faith	No original research	
Current events		<ul> <li>Please sign and date your posts by typin</li> </ul>	ng four tildes (~~~~).	<ul> <li>Avoid personal attacks</li> </ul>	Neutral point of view	
Random article		<ul> <li>New to Wikipedia? Welcome! Ask question</li> </ul>	ons, get answers.	Be welcoming	Verifiability	
Donate to Wikipedia						
▼ Interaction		This article is of interest to the following WikiProjects: [hide]			[hide]	
Help			WikiProject Cephalopod	5	[show]	
About Wikipedia Community portal			WikiDroject Marine life (Dated P	alaas High importance)		
Recent changes			wikiProject Marine me (Rated b	class, high-importance)	[snow]	
Contact Wikipedia		WikiProjec	t Fisheries and Fishing (Rated B	class, High-importance)	[show]	
Toolbox		Wiki	Project Food and drink (Rated C	class, Mid-importance)	[show]	
Print/export						
	17.000	Contents [hide]			This article has been the Version 1.0 Edito	reviewed by
	1 Feuthida vs. Sep	biolida etc.				indi rediti.
	2 Calaman Etymo	logy?			the Version 0.7 relea	i nominee for ise of
	Jimanue				Wikipedia. See the n	ominations

Namespaces are translated into editions' languages: http://en.wikipedia.org/wiki/Talk:Squid http://es.wikipedia.org/wiki/Discusi%C3%B3n:Teuthida http://it.wikipedia.org/wiki/Discussione:Teuthida http://ja.wikipedia.org/wiki/%E3%83%8E%E3%83%BC %E3%83%88:%E3%82%A4%E3%82%AB

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#### Edits:

WIKIPEDIA he Free Encyclopedia	Editing Squid From Wikipedia, the free encyclopedia	
ain page ontents atured content irrent events	You are not currently logged in. If you save any edits, your IP address will be recorded publicly in this page's edit history. If you create an account, you can conceal your IP address and be provided with many other benefits. Messages sent to your IP can be viewed on your talk page. Please do not save test edits. If you want to experiment, please use the sandbox. If you need any help getting started with editing, see the New contributors' help page.	
andom article onate to Wikipedia	B I 🖾 ∞ 🔊 → Advanced → Special characters → Help → Cite	
nteraction Help About Wikipedia Community portal Recent changes Contact Wikipedia Toolbox	<pre>{{other uses}} {{Automatic taxobox   taxon = Teuthida   fossil_range = (at least) {{fossil range Late Cretaceous Recent ref=<ref name="Tanabe2006">{{Cite journal   last1 = Tanabe   first1 = K.   last2 = Hikida   first2 = Y.   last3 = Tba   first3 = Y.   year = 2006   title = Two Coleoid Jaws from the Upper Cretaceous of Hokkaido, Japan   journal = Journal of Paleontology   volume = 80   issue = 1   pages = 138-145   doi = 10.1666/0022-3360(2006)080[0138:TCJFTU]2.0.C0;2   postscript = <!--None--></ref></pre>	

#### http://en.wikipedia.org/w/index.php?title=**Squid**&action=**edit** http://en.wikipedia.org/w/index.php?title=**Talk:Squid**&action=**edit**

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& Log in / create account

#### Preview, changes and save:

```
/ pages = 150-145
/ doi = 10.1666/0022-3360(2006)080[0138:TCJFTU]2.0.CO;2
/ postscript = <!--None-->
}}</ref>}
/ image = Sepioteuthis lessoniana (Bigfin reef squid).jpg
/ image_caption = [[Bigfin Reef Squid]], ''Sepioteuthis lessoniana''
/ authority = [[Adolf Naef|A. Naef]], 1916
/ subdivision_ranks = [[Suborders]]
/ subdivision =
/[[Plesioteuthididae]] <small>(''[[incertae sedis]]'')</small><br>
[[Myopsina]]
```

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Edit summary (Briefly describe the changes you have made)

Save page X Show preview X Show changes Cancel Editing help (opens in new window)

If you do not want your writing to be edited, used, and redistributed at will, then do not submit it here. All text that you did not write yourself, except brief excerpts, must be available under terms consistent with Wikipedia's Terms of Use before you submit it.

#### http://en.wikipedia.org/w/index.php?title=Squid&action=submit http://en.wikipedia.org/w/index.php?title=Squid&action=submit **save**

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#### History review:

R and

& Log in / create account

δΩWU	Article Discussion Read Edit View history Search Q									
WIKIPEDIA The Free Encyclopedia	Revision history of Squid From Wikipedia, the free encyclopedia View logs for this page									
Main page Contents Featured content Current events Random article	Browse history From year (and earlier): From month (and earlier): all Tag filter: Deleted only Go									
Donate to Wikipedia	For any version listed below, click on its date to view it. For more help, see Help:Page history and Help:Edit summary. External tools: Revision history statistics @ • Contributors @ • Revision history search @ • Number of watchers @ • Page view statistics @ (cur) = difference from current version (prev) = difference from preceding version m = minor edit → = section edit ← = automatic edit summary									
Help About Wikipedia Community portal Recent changes Contact Wikipedia	(latest   earliest) View (newer 50   older 50) (20   50   100   250   500) Compare selected revisions									
	<ul> <li>(cur   prev)          <ul> <li>12:45, 12 August 2011 Ajreinoso (talk   contribs) (20,384 bytes) (undo)</li> <li>(cur   prev)                   <ul></ul></li></ul></li></ul>									
P TOODOX	(cur   prev) □ 17:12, 23 July 2011 99.0.82.226 (talk) (20,384 bytes) (Undid revision 441028123 by Jayjaybitoon (talk)) (undo)     (cur   prev) □ 17:11, 23 July 2011 Jayjaybitoon (talk   contribs) (20,296 bytes) (undo)     (cur   prev) □ 17:09, 22 July 2011 00,092,226 (talk) (20,294 bytes) (Undid revision 441027641 by Jayjaybitoon (talk)) (undo)									
	<ul> <li>(cur   prev) ◎ 17:07, 23 July 2011 Jayjaybitoon (talk   contribs) (20,355 bytes) (undo)</li> </ul>									

• (cur | prev) 💿 18:15, 13 July 2011 JD-Nibelheim (talk | contribs) (20,384 bytes) (Removing "marine" from first sentence since "Cephalopod" are

#### http://en.wikipedia.org/w/index.php?title=Squid&action=history

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#### Search operations:

17 . Dr. 8		🚨 Log in / create accoi
	Special page	searchTest
WANNED DA A	Search results	
The Free Encyclopedia	From Wikipedia, the free encyclopedia	
	For search options, see Help:Searching.	
Main page Contents	searchTest Search	
Featured content Current events	Did you mean: searchtext	
Random article Donate to Wikipedia	Content pages Multimedia Help and Project pages Everything Advanced	
<ul> <li>Interaction</li> </ul>	There were no results matching the query.	
Help About Wikipedia Community portal Recent changes Contact Wikipedia	The page "SearchTest" does not exist. You can ask for it to be created, but consider checking the search results below to see whether the topic is all For search help, please visit Help:Searching.	ready covered.
<ul> <li>Toolbox</li> </ul>	Privacy policy About Wikipedia Disclaimers Mobile view	WIKIMEDIA project

http://en.wikipedia.org/wiki/Special:Search?search=Linux http://en.wikipedia.org/w/index.php?title=**Special**%3ASearch&search=Linux http://es.wikipedia.org/w/index.php?title=**Especial**%3ASearch&search=Linux

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The WikiSquilter project is the software tool developed to parse and filter the information from the Squid log lines.

- Tailored Java written application.
  - Multithreaded capabilities.
  - Good performance database drivers.
- Three basic functionalities:
  - **Parsing**: The application parses the information elements from the log lines.
  - Filtering: Determination of the information elements considered of interest.
  - **Storage**: Filtered elements are normalized and stored in a MySQL relational database.

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- Strong adherence to SE principles:
  - Robustness: 15,000 million lines successfully processed.
  - Extensibility: Highly modular and coupling reduced to the minimum.
  - Efficiency: Multithreaded approach, filter mechanism based in a hash structure, and
  - Flexibility: Parameters of the analysis fully configurable. The structure acting as the filter is built upon the specifications of an XML file.

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```
<filter cfg>
    <WikiMediaProject dbCode="0" name="WIKIPEDIA">
  <NNSS INDEXES>
    <NSINDEX>ARTICLE</NSINDEX>
    <NSINDEX>INDEX</NSINDEX>
    <NSINDEX>ARTICLE TALK</NSINDEX>
    <NSINDEX>USER</NSINDEX>
    <NSINDEX>USER TALK</NSINDEX>
    <NSINDEX>SPECIAL</NSINDEX>
  </NNSS INDEXES>
  <Language dbCode="EN" name="ENGLISH">
    <NameSpaces><NS>Talk</NS><NS>User</NS><NS>User Talk</NS><NS>Special</NS></NameSpace
  </Language>
  <Language dbCode="DE" name="GERMAN">
    <NameSpaces>
      <NS>Diskussion</NS><NS>Benutzer</NS><NS>Benutzer Diskussion</NS><NS>Spezial</NS>
    </NameSpaces>
  </Language>
  <Language dbCode="JA" name="JAPANESE">
    <NameSpaces>
      <NS>%E3%83%8E%E3%83%BC%E3%83%88<//>
<NS>%E5%88%A9%E7%94%A8%E8%80%85<//>

      <NS>%E5%88%A9%E7%94%A8%E8%80%85%E2%80%90%E4%BC%9A%E8%A9%B1</NS>
      <NS>%E7%89%B9%E5%88%A5</NS>
    </NameSpaces>
  </Language>
  <Actions> <Action>edit</Action>
                                   <Action>save</Action> </Action>
  <Methods> <Method>GET</Method>
                                  <Method>POST</Method> </Methods>
</filter cfg>
                      Antonio J. Reinoso
                                            Temporal and Behavioral patterns in the use of Wikipedia
```

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## Parsing

May 6 13:46:04 208.80.152.138 22260437 2010-05-06T13:42:43.827

http://en.wikipedia.org/wiki/April - 2 GET

The application parser an analyzes each **log line** to extract:

- The Squid date and time.
- The URL as a block.
- Whether the URL caused a save operation.
  - The response time.
  - The request method.

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# Parsing http://en.wikipedia.org/wiki/April http://en.wikipedia.org/wiki/Talk:April The application tokenizes the URL to determine: • The Wikimedia Foundation Project. • The language edition.

- The targeted namespace.
- The article's title.

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#### Parsing

Requests for actions are a bit difficult to scan

http://<u>en.wikipedia.org/w/index.php?</u> title=London\&action=<u>history</u>

http://de.wikipedia.org/w/index.php?
title=Diskussion:Berlin\&action=edit

http://it.wikipedia.org/w/index.php?
title=Utente\%3AAjreinoso\&action=history

URLs specifying actions are first assigned to a fictitious *Index* namespace.

If language, project and action are of interest, the URL is reparsed to determine the article's title and namespace.

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#### **Overall performance**

After all our efforts:

- The traffic corresponding to a whole month is processed in 1 day and six hours in a quad-core system running under Ubuntu server and equipped with 8 GB of RAM memory.
- Such traffic consists in about 1,300 million log lines.
- 80% of the total time corresponds to the indization of the tables.
- In average, the application analyzes 60,000 log lines per second.

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#### **Methodology.** Answering the research questions

#### Once data are available in the database, we undertake...

- The validation of part of our results using several sources (WMF info, Ortega's WikiXRay and Alexa).
- The finding of **temporal patterns** and periodicity (autocorrelation and cross-correlation).
- The study of the **behavioral habits** (participation, reluctance...) exhibited through the requests.
- The attention attracted by **featured contents**. Two perspectives: promotion and inclusion in main pages (Comparative tests such as Wilcoxon rank-sum test).
- The most visited, contributed and searched topics. (Grouping by md5 hash of articles' titles and searched strings followed by manual classification based on Spoerry's one)

#### Traffic characterization has been already performed!!

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#### **Results. Validation.**

As some sources are not sampled, our results should maintain a ratio with them similar to the sampling factor (1%).

Lang.	Jan.	Feb.	Mar.	Apr.	May.	Jun.
DE	10,821,625	6,833,171	8,034,636	6,945,878	7,612,949	7,249,244
(Reinoso)						
DE (Mituzas)	1,271 M	982 M	978 M	817 M	875 M	909 M
Ratio	0.009	0.007	0.008	0.009	0.009	0.008
EN	47,369,841	43,136,627	51,845,199	48,242,580	48,085,156	43,950,168
(Reinoso)						
EN (Mituzas)	5,615 M	5,944 M	6,092 M	5,989 M	6,066 M	5,819 M
Ratio	0.0084	0.0073	0.0085	0.0081	0.0079	0.0076

Edits

Visits

Lang.	Jan.	Feb.	Mar.	Apr.	May.	Jun.
DE (Reinoso)	11,041	9,457	10,341	8,361	8,052	7,754
DE (Zachte)	876 K	752 K	802 K	655 K	684 K	701 K
DE (Ratio)	0.0126	0.0126	0.0129	0.0128	0.0118	0.0111
EN (Reinoso)	53,121	46,778	54,564	47,921	47,692	42,282
EN (Zachte)	4,300 K	4,200 K	4,400 K	4,000 K	4,300 K	4,000 K
EN (Ratio)	0.0124	0.0111	0.0124	0.0120	0.0111	0.0106

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#### **Results. Validation.**

#### Results also match at a much finer grain (level of articles)



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#### **Results. Representativeness.**

Do the considered elements correspond to a significant part of the traffic to Wikipedia?

- 90%: Traffic attracted by our considered Wikipedias.
- 85%: Requests directed to our namespaces.
- 94%: Filtered edit requests from the total of save op.
- 99%: Search operations which have always to be filtered.

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#### **Results. Traffic characterization.**

#### Traffic characterization.

Traffic is computed in terms of number of requests disregarding amount of information or transfer rates.

 Requests to Wikipedia and to previous uploaded images and media constitute the 96% of the traffic.



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#### **Results. Traffic characterization**

Percentage of the traffic corresponding to each type of request.

Ed.	Visits	Actions	Edit	Search	Api	Skins	icons	mw	Undet.
	to	(except	op.	op.	calls	/css		ext.	
	articles	search)							
EN	21.51%	22.52%	0.27%	4.75%	6.53%	34.62%	4.38%	3.47%	6.95%
DE	16.54%	20.87%	0.23%	4.09%	7.69%	30.74%	3.46%	14.72%	5.98%
ES	13.58%	33.90%	0.31%	4.12%	6.02%	32.13%	3.68%	3.89%	6.80%
FR	18.24%	23.15%	0.33%	4.00%	6.05%	36.87%	4.42%	4.23%	7.04%
IT	19.80%	21.81%	0.43%	4.44%	5.77%	37.57%	4.49%	3.07%	9.69%
JA	20.69%	25.15%	0.37%	4.22%	3.95%	36.01%	4.19%	2.81%	9.22%
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## GSvC

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#### **Results. Traffic characterization**

#### Relationship between traffic and editions' sizes.



The Spanish and Russian Wikipedias are the smallest regarding their number of articles but attract much more traffic than other larger editions.

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# Comparison among the traffic composed by our filtered requests, the traffic to all the WMF projects, and to Wikipedia.



Wikipedia traffic is positively correlated to the traffic to all the Wikimedia Foundation projects.

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#### Monthly evolution.



Monthly number of actions (DE)

Antonio J. Reinoso ajreinoso@libresoft.es Temporal and Behavioral patterns in the use of Wikipedia Doctoral thesis Móstoles (Madrid) September 2011

Monthly number of actions (EN)

## Weekly evolution.

Number of daily requests of each type during every whole week of 2009 (ES)



we study libre souware

- Periodicity in visits, searches and requests to edit.
- It is very difficult to pronounce about the rest of actions: Atypical character and too small number of requests.

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#### Evolution of visits and edits throughout the days of the week.



- Close evolutions in the DE, EN, ES, IT and RU editions.
- Edits raise in weekends in FR, JA, NL and PL. Elite of authors?

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#### **Results. Behavioral patterns**

Relationships among the different types of requests:

- Positive correlation of visits and edits throughout the days of the week in DE, EN, ES, IT and RU editions.
   Negative in the case of Dutch and Japanese editions.
- Positive correlation of edits and req. to edit also in DE, EN, ES, IT and RU editions: Massive collaboration.

Corr. of visits and edits for the days of the week (DE)



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#### **Results. Behavioral patterns**

Analysis of the edits/visits ratio for the different Wikipedias:

Edits/Visits throughout 2009

• A good indicator of proactivity and participation.



- Three groups: G1(NL, PL, IT, FR, RU), G2(ES, PT, EN, DE) and G3(JA).
- Both types of Wikipedias (having or not an elite of users) present high ratios of edits to visits.

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#### **Results. Behavioral patterns**

Analysis of the **performed edits/requested edits ratio:** Users' reluctance:

Edition	Edits	Edit requests	Percentage of finished edits
IT	57447	632295	9.09%
FR	76377	941017	8.12%
NL	29799	379450	7.85%
PL	31199	419411	7.44%
RU	60516	814103	7.43%
DE	102442	1426027	7.18%
EN	533879	8026886	6.65%
PT	28469	584498	4.87%
ES	66547	1666890	3.99%
JA	47546	2079305	2.29%

Wikipedias having the highest ratios of edits to visits are also the ones having highest percentages of finished edits.

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#### **Results. Featured articles**

Significant increase in the number of visits to the "Today's featured articles" during the month of their presentation for all the considered editions **except the Spanish one**.



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#### **Results. Featured articles**

Boxplots picturing the visits to the featured articles just promoted in the same periods.



Different patterns of visits as a result of the different dynamics in the promotion processes.

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#### **Results. Most popular contents**

Classification of contents most visited and edited in several Wikipedias:

Category	DE (Visited)	DE (Edited)	EN (Visited)	EN (Edited)	ES (Visited)	ES (Edited))	FR (Visited)	FR (Edited)
Category	DE (Visited)	DE (Edited)	EN (Visited)	EN (Edited)	ES (Visited)	ES (Edited)	FR (Visited)	FR (Edited)
MAIN	47.28%	0.00%	74.05%	0.00%	7.41%	0.00%	57.77%	0.00%
CUR	5.53%	20.27%	6.18%	28.30%	7.76%	5.94%	8.18%	11.58%
GEO	11.60%	14.40%	1.55%	11.16%	11.66%	18.47%	9.51%	24.73%
ICT	5.97%	7.64%	2.26%	2.27%	10.66%	1.17%	2.79%	0.58%
ENT	16.64%	16.17%	10.92%	31.63%	14.48%	50.53%	9.00%	23.74%
POL	5.25%	13.18%	2.36%	10.37%	4.31%	4.88%	2.15%	6.29%
SCI	2.97%	6.42%	0.95%	1.36%	22.72%	6.16%	1.72%	3.72%
ART	2.25%	17.17%	0.16%	12.33%	17.70%	12.10%	4.63%	28.21%
SEX	2.50%	0.22%	1.47%	0.00%	0.18%	0.00%	0.61%	0.25%
UNDETERMINED	0.00%	4.54%	0.09%	2.57%	3.13%	0.74%	3.63%	0.91%

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#### **Results.** Future work.

The work developed in this thesis can be extended in serveral ways.

- 1. Visits and edit distributions.
- 2. Study of time series.
- 3. Geolocation.
- 4. Consensus process.
- 5. Access through different interfaces and devices.
- 6. Automatic categorization.

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#### **Results. Related publications.**

- Temporal characterization of the requests to Wikipedia.
   5th International Workshop on new Challenges in Distributed Information Filtering and Retrieval (DART'11)
- A quantitative examination of the impact of featured articles in Wikipedia.

International Conference on Software and Data Technologies (ICSOFT'11)

A statistical approach to the impact of featured articles in Wikipedia.

International Conference on Knowledge Engineering and Ontology Development (KEOD'10)

- A quantitative approach to the use of Wikipedia. IEEE Symposium on Computers and Communications (ISCC'09)
- Quantitative analysis and characterization of Wikipedia requests.

ACM WikiSym 2008: 4th International Symposium on Wikis (WikiSym'08)

Workshop on interdisciplinary research on Wikipedia and Wiki communities.

ACM WikiSym 2008: 4th International Symposium on Wikis (WikiSym'08)

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#### **Results. Related publications.**



#### Wikipedians' weekends in international comparison

A paper titled "Temporal characterization of the requests to Wikipedia" examined how search requests, read accesses and edits on Wikipedia change over time, and relate to those at the entirety of Wikimedia sites (based on squid logs for the whole year of 2009, provided by the Wikimedia Foundation). Among findings are differences between language versions of Wikipedia, such as that the "the number of edits tends to raise in weekends" for the French, Japanese, Dutch and Polish Wikipedia, but not for other languages. Another paper, titled "Circadian patterns of Wikipedia editorial activity: A demographic analysis"<sup>[9]</sup>, similarly analyzed "34 Wikipedias in different languages [trying] to characterize and find the universalities and differences in temporal activity patterns of editors", with the underlying data provided by the German Wikimedia chapter from the toolserver. They found that "in contrast to diurnal [daily] pattern, which is universal to a great extent, weekly activity patterns of WPs show remarkable differences. We could, however, identify two main categories, namely 'weekends' and 'working days' active WPs."<sup>[10]</sup>

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# GSyc Any questions...?

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