

Building a Big Data DWH

Data Warehousing on Hadoop

Friso van Vollenhoven
CTO

@fzk
frisovanvollenhoven@godatadriven.com



GoDataDriven

PROUDLY PART OF THE XEBIA GROUP

“In computing, a data warehouse or enterprise data warehouse (DW, DWH, or EDW) is a database used for reporting and data analysis.”

-- Wikipedia



Q

1. [^] Moeller, Robert (2007). COSO Enterprise Risk Management: Understanding the New Integrated

W Data analysis – Wikipedia, x

en.wikipedia.org/wiki/Data_analysis

Create account Log in

Article

Talk

Read

Edit

View history

Search

Data analysis

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Analysis of data (datalytics) is a process of inspecting, cleaning, transforming, and modeling **data** with the goal of highlighting useful [information](#), suggesting conclusions, and supporting decision making. Data analysis has multiple facts and approaches, encompassing diverse techniques under a variety of names, in different business, science, and social science domains.

[Data mining](#) is a particular data analysis technique that focuses on modeling and knowledge discovery for predictive rather than purely descriptive purposes. [Business intelligence](#) covers data analysis that relies heavily on aggregation, focusing on business information. In [statistical applications](#), some people divide data analysis into [descriptive statistics](#), [exploratory data analysis](#) (EDA), and [confirmatory data analysis](#) (CDA). EDA focuses on discovering new features in the data and CDA on confirming or falsifying existing hypotheses. [Predictive](#)

WIKIPEDIA

The Free Encyclopedia

Main page

Contents

Featured content

Current events

Random article

Donate to Wikipedia

Interaction

Help

About Wikipedia

Community portal

Recent changes

Contact Wikipedia

Toolbox

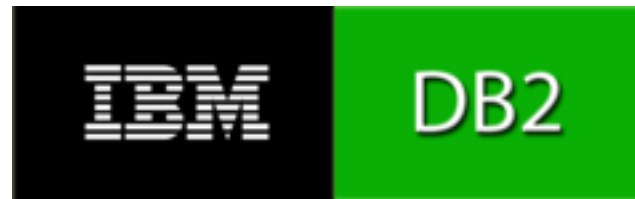
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DB2



The Power of Now

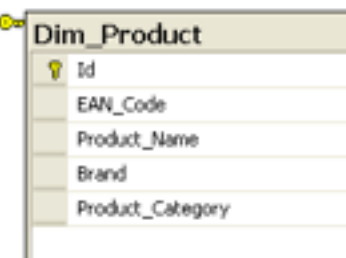
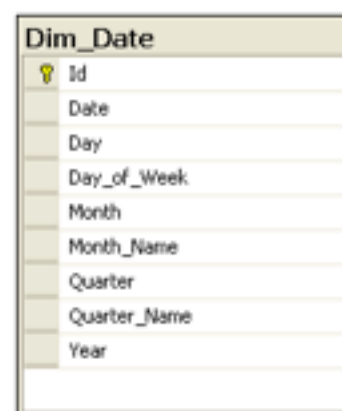
QlikView




Microsoft Office





ETL



Dim_Date	
	Id
	Date
	Day
	Day_of_Week
	Month
	Month_Name
	Quarter
	Quarter_Name
	Year

Fact_Sales	
	Date_Id
	Store_Id
	Product_Id
	Units_Sold

Dim_Store	
	Id
	Store_Number
	State_Province
	Country

Dim_Product	
	Id
	EAN_Code
	Product_Name
	Brand
	Product_Category



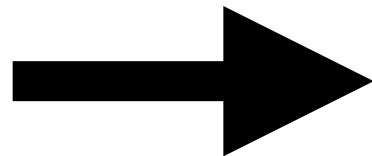
How to:

- Add a column to the facts table?
- Change the granularity of dates from day to hour?
- Add a dimension based on some aggregation of facts?

Schema's are designed
with questions in mind.

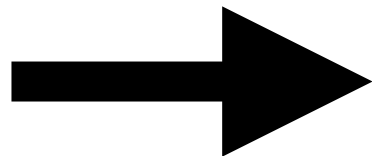
Changing it requires to
redo the ETL.

Schema's are designed
with questions in mind.



Push things to the facts
level.

Changing it requires to
redo the ETL.



Keep all source data
available all times.

MORE
DATA,
PLEASE



And now?

- MPP databases?
- Faster / better / more SAN?
- (RAC?)





metadata + query engine



distributed processing



distributed storage

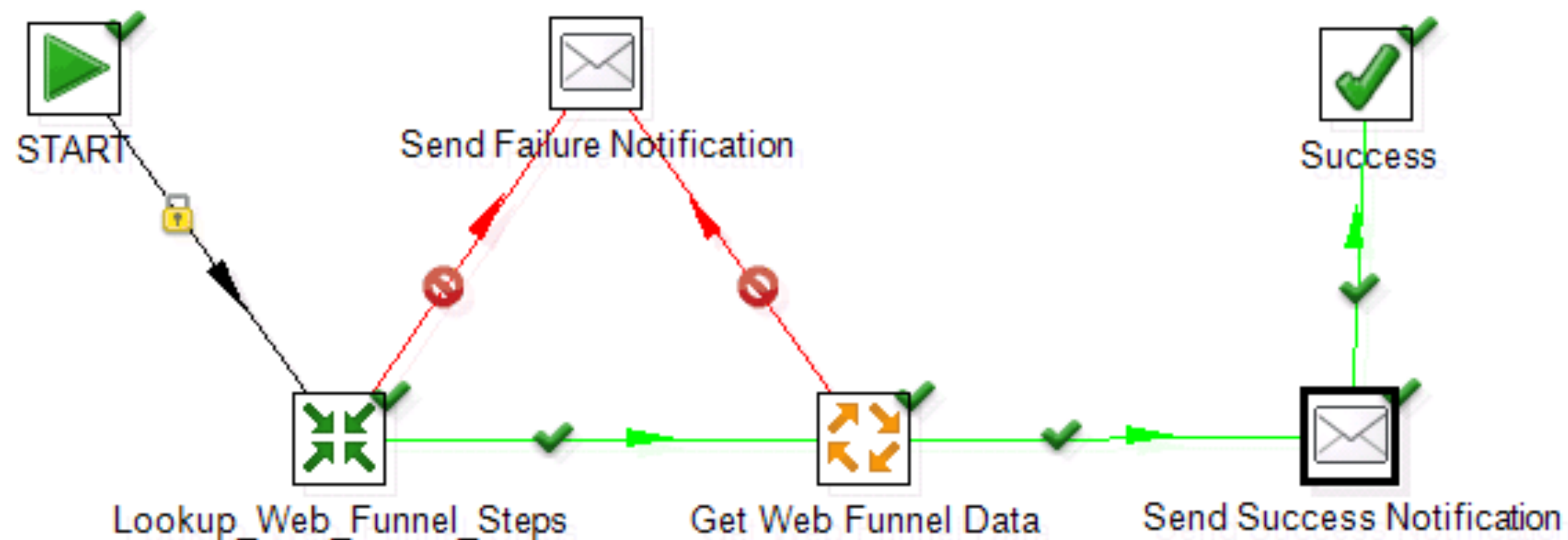
create-table.sql

```
1 CREATE EXTERNAL TABLE source_data (  
2     host STRING,  
3     dt STRING,  
4     request STRING,  
5     status_code STRING,  
6     response_length STRING,  
7     referrer STRING,  
8     user_agent STRING)  
9 ROW FORMAT SERDE 'org.apache.hadoop.hive.contrib.serde2.RegexSerDe'  
10 WITH SERDEPROPERTIES (  
11     'input.regex' = '(\d{1,3}.\d{1,3}.\d{1,3}.\d{1,3}) -- \d{1,2}/[a  
12     'output.format.string' = '%1$s %2$s %3$s %4$s %5$s %6$s %7$s')  
13 STORED AS TEXTFILE  
14 LOCATION '/source_data/myfiles/';  
15  
16  
17 SELECT host, count(*) AS request_count FROM source_data  
18 WHERE dt > '2013-01-01'  
19 GROUP BY host;  
20
```

EXTRACT

TRANSFORM

LOAD





Shell

etl.sh

```
1  #!/bin/bash
2  set -ex
3
4  echo \
5  'open ftp.example.com
6  user username password
7  cd my-files
8  find /' > /tmp/ftp-list-command.txt
9
10 lftp -f /tmp/ftp-list-command.txt | grep "\.gz" > /tmp/full-names-on-ftp.txt
11
12 hadoop fs -ls -R /staging/my-files/ > /tmp/full-names-on-hadoop.txt
13 hadoop fs -ls -R /sources/my-files/ >> /tmp/full-names-on-hadoop.txt
14
15 cat /tmp/full-names-on-hadoop.txt | grep "\.gz" | awk '{print $8}' | awk -F '/' '{print $NF}' > /tmp/basenames-on-hadoop.txt
16
17 cat /tmp/full-names-on-ftp.txt | fgrep -v -f /tmp/basenames-on-hadoop.txt > /tmp/missing-files-on-hadoop.txt
18
19 echo \
20 'open ftp.example.com
21 user username password
22 ' > /tmp/ftp-get-files-command.txt
23 awk '{print "get -c " $0}' /tmp/missing-files-on-hadoop.txt >> /tmp/ftp-get-files-command.txt
24
25
26 cd /local-data/staging/my-files/
27 lftp -vf /tmp/ftp-get-files-command.txt
28 cd -
29
30 while read f
31 do
32     filename=$(echo $f | awk -F '/' '{print $NF}')
33     year=${filename:0:4}
34     month=${filename:4:2}
35     day=${filename:6:2}
36     site=$(echo $f | awk -F '-' '{print $NF}' | sed s/\.gz//g)
37
38     hadoop fs -mkdir "/staging/my-files/$year/$month/$day/$site"
39     hadoop fs -put "/local-data/staging/my-files/$filename" "/staging/my-files/$year/$month/$day/$site/$filename.upload"
40     hadoop fs -mv "/staging/my-files/$year/$month/$day/$site/$filename.upload" "/staging/my-files/$year/$month/$day/$site/$filename"
41 done < /tmp/missing-files-on-hadoop.txt
```


etl.jy

```
1 client = FTPClient(FTP_HOST, FTP_USER, FTP_PASSWORD)
2 remote_files = ftp_file_list(client, FTP_ROOT_DIR)
3
4 fs = hfs.FileSystem.get(hconf.Configuration())
5 hadoop_files = hdfs_file_list(fs, HDFS_ROOT_DIR_STAGING)
6 hadoop_files.extend(hdfs_file_list(fs, HDFS_ROOT_DIR_SOURCES))
7
8 missing_files = filter(lambda f: f not in hadoop_files, remote_files)
9
10 filename_pattern = re.compile(r"(\d{4})(\d{2})(\d{2})\d{4}-\d{12}-(\d{6})\.gz")
11
12 for missing_file in missing_files:
13     temp_file = File(FTP_LOCAL_DOWNLOAD_PATH, missing_file)
14     client.download(missing_file, temp_file)
15
16     year, month, day, site = filename_pattern.match(missing_file[1].name).groups()
17     hdfs_dir = hfs.Path('%s/%s/%s/%s/%s' % (HDFS_UPLOAD_BASE_PATH, year, month, day, site))
18
19     hdfs_dir = hfs.Path('%s/%s/%s/%s/%s' % tuple(filename_pattern.match(missing_file).groups()))
20
21     if (not fs.exists(hdfs_dir)):
22         fs.mkdirs(hdfs_dir)
23
24     fs.copyFromLocalFile(hfs.Path(temp_file.path), hfs.Path(remotedir, remotefilename + '.upload'))
25     fs.rename(hfs.Path(remotedir, remotefilename + '.upload'), hfs.Path(remotedir, remotefilename))
26
27     os.unlink(localfile.path)
28
29
30 fs.close()
31 client.disconnect(False)
32
```



- No JVM startup overhead for Hadoop API usage
- Relatively concise syntax (Python)
- Mix Python standard library with any Java libs

CRONTAB(1)

BSD General Commands Manual

CRONTAB(1)

NAME

crontab -- maintain crontab files for individual users (V3)

SYNOPSIS

crontab [-u user] file
crontab [-u user] { -l | -r | -e }

DESCRIPTION

The **crontab** utility is the program used to install, deinstall or list the tables used to drive the cron(8) daemon in Vixie Cron. Each user can have their own crontab, and they are not intended to be edited directly.

(Darwin note: Although cron(8) and crontab(5) are officially supported under Darwin, their functionality has been absorbed into launchd(8), which provides a more flexible way of automatically executing commands. See launchctl(1) for more information.)

If the /usr/lib/cron/cron.allow file exists, then you must be listed therein in order to be allowed to use this command. If the /usr/lib/cron/cron.allow file does not exist but the

:



Jenkins

- Flexible scheduling with dependencies
- Saves output
- E-mails on errors
- Scales to multiple nodes
- REST API
- Status monitor
- Integrates with version control

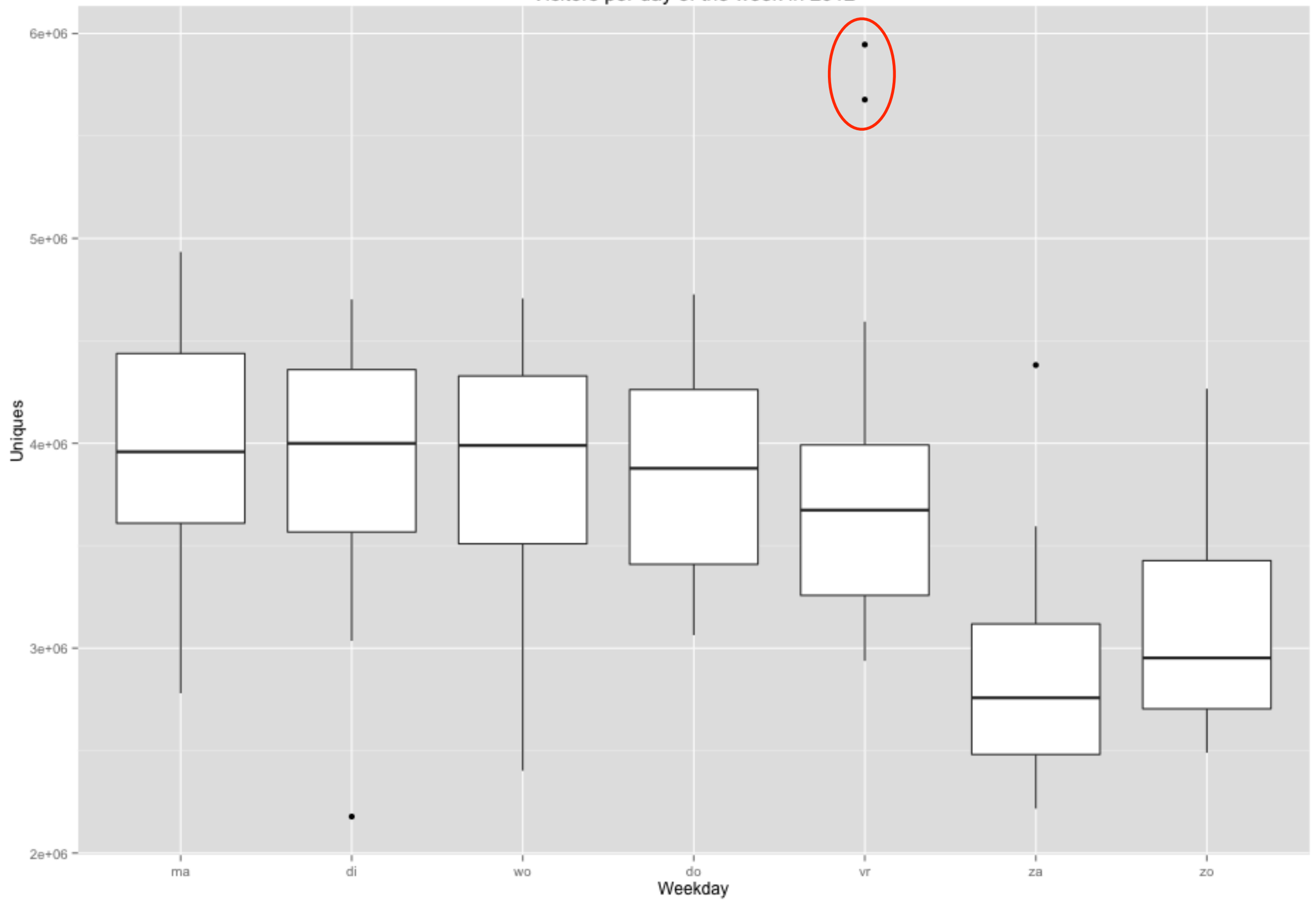
http://localhost:8080 (All)	
successful job #380	
successful job running #291	
unstable job #552	
unstable job running #237	
aborted or disabled job #307	
aborted job running #256	
failed job #593	
failed job running #308	
queued job number 1 #464	•
queued job number 2 #462	•
queued job number 3 #394	•
job with failed api call	

Deployment

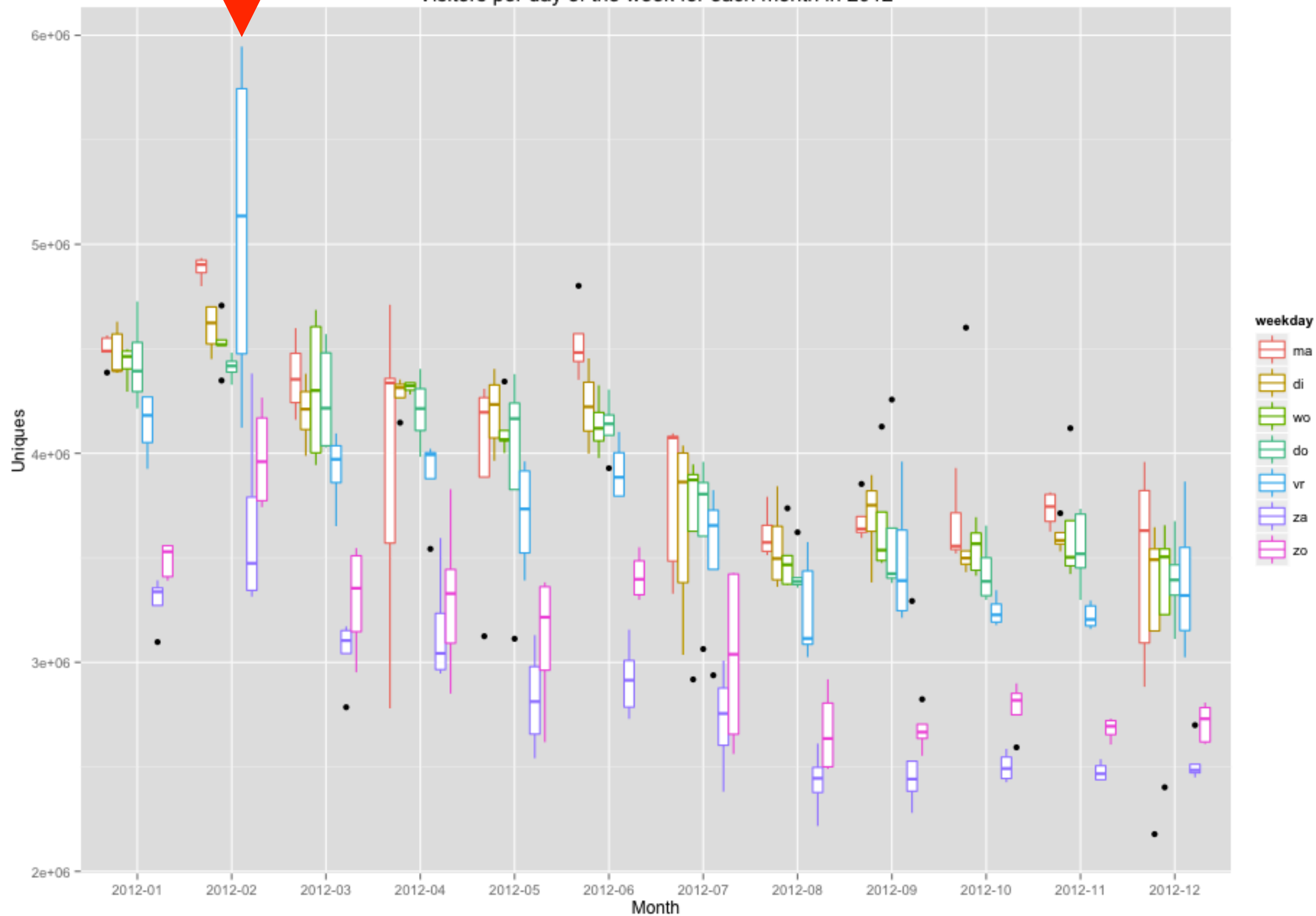
```
git push jenkins master
```


- Scheduling
- Simple deployment of ETL code
- Scalable
- Developer friendly

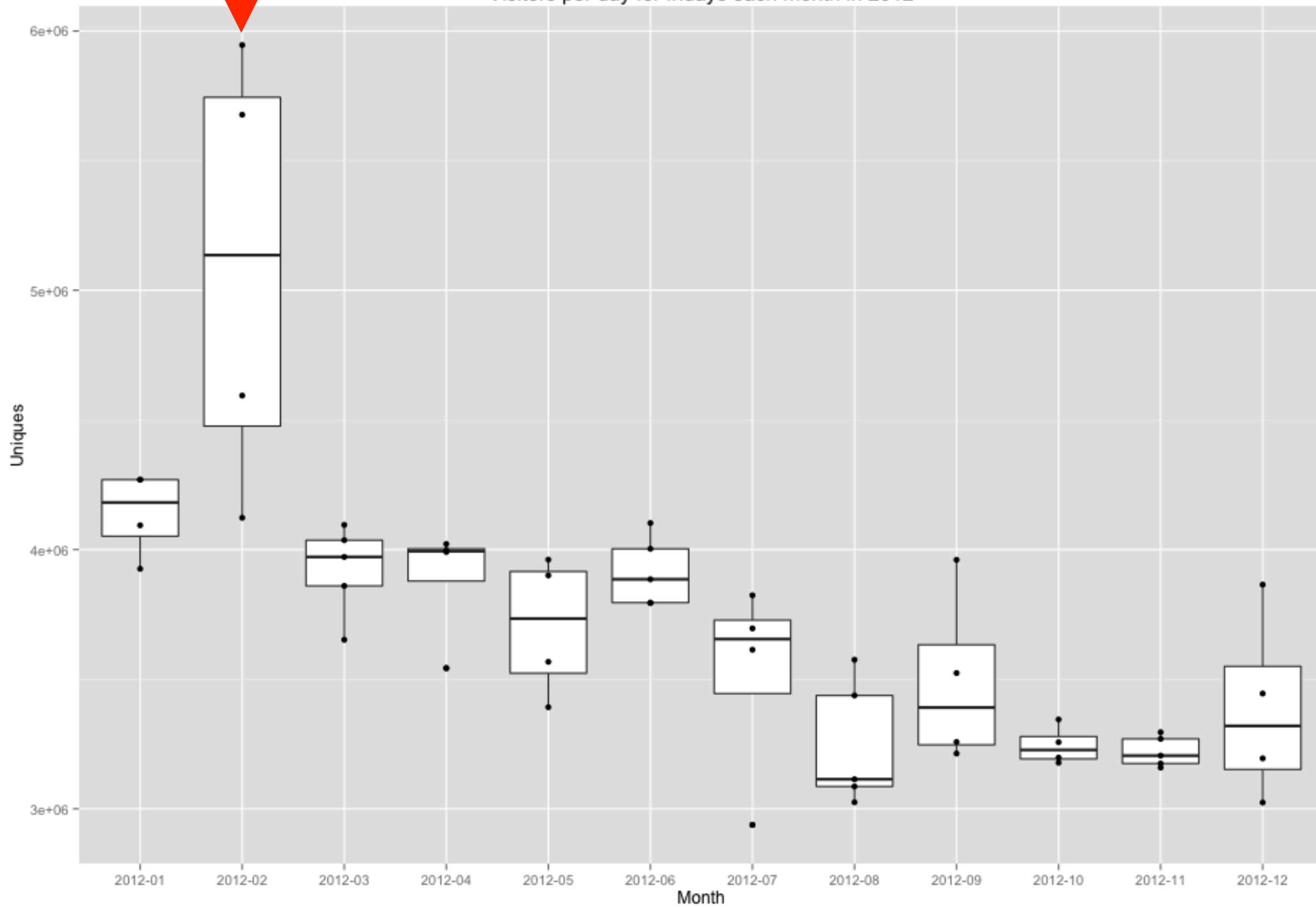
Visitors per day of the week in 2012

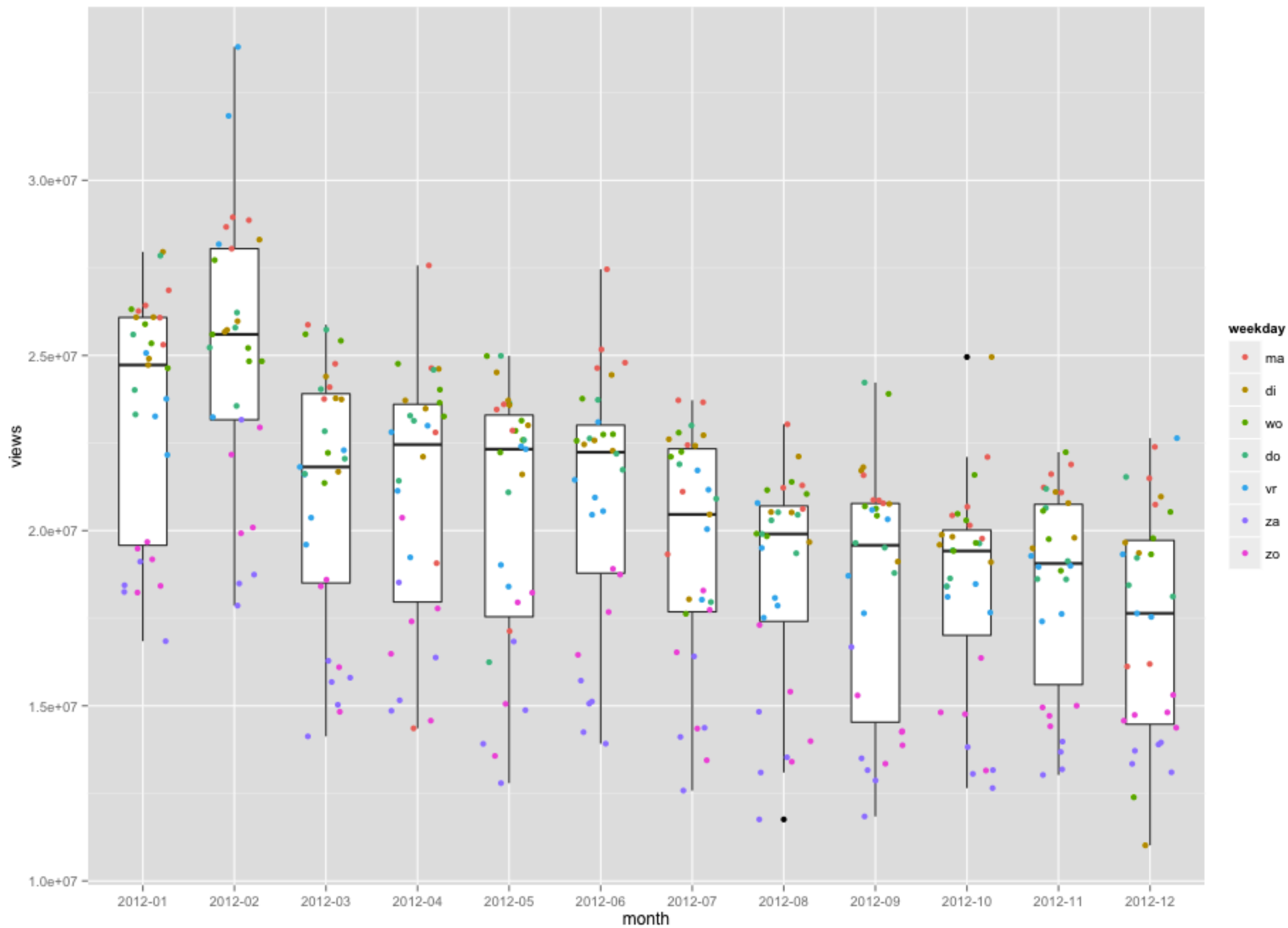


Visitors per day of the week for each month in 2012



Visitors per day for fridays each month in 2012





PUBLIC SERVICE ANNOUNCEMENT:

OUR DIFFERENT WAYS OF WRITING DATES AS NUMBERS CAN LEAD TO ONLINE CONFUSION. THAT'S WHY IN 1988 ISO SET A GLOBAL STANDARD NUMERIC DATE FORMAT.

THIS IS *THE* CORRECT WAY TO WRITE NUMERIC DATES:

2013-02-27


THE FOLLOWING FORMATS ARE THEREFORE DISCOURAGED:

02/27/2013 02/27/13 27/02/2013 27/02/13

20130227 2013.02.27 27.02.13 27-02-13

27.2.13 2013. II. 27. $27\frac{1}{2}$ -13 2013.158904109

MMXIII-II-XXVII MMXIII $\frac{\text{LVII}}{\text{CCCLXV}}$ 1330300800

$((3+3) \times (111+1) - 1) \times 3 / 3 - 1 / 3^3$ ~~2013~~ 

10/11011/1101 02/27/20/13 $\begin{matrix} 2 & 3 & 1 & 4 \\ 0 & 1 & 2 & 3 & 7 \\ 5 & 6 & 7 & 8 \end{matrix}$

'februari-22 2013'



Does Amazon S3 fail sometimes? [closed]



2



1

We just added an autoupdater in our software and got some bug report saying that the autoupdate wouldn't complete properly because the downloaded file's sha1 checksum wasn't matching. We're hosted on Amazon S3...

That's either something wrong with my code or something wrong with S3.

I reread my code for suspicious stuff and wrote a simple script downloading and checking the checksum of the downloaded file, and indeed got a few errors once in while (1 out of 40 yesterday). Today it seems okay.

Did you experience that kind of problem? Is there some kind of workaround ?

extra info: test were ran in Japan.

[download](#)[amazon-s3](#)[share](#) | [improve this question](#)

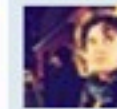
edited May 3 '12 at 0:18



Chilledrat

1,598 ● 2 ● 9 ● 17

asked Aug 28 '08 at 1:25



poulejapon

4,174 ● 1 ● 18 ● 39

closed as not constructive by the Tin Man, vstm, EJP, 0x7fffffff, xdazz
Oct 6 '12 at 6:40

As it currently stands, this question is not a good fit for our Q&A format. We expect answers to be supported by facts, references, or specific expertise, but this question will likely solicit debate, arguments, polling, or extended discussion. If you feel that this question can be improved and possibly reopened, [see the FAQ](#) for guidance.

A: Yes, sometimes as often as 1 in every 10K calls. Or about once a week at 3K files / day.


friso@fvv:/tmp/data \$ ls

total 8					
-rw-r--r--	1	friso	wheel	0B	29 mei 10:57 i-am-void.gz
-rw-r--r--	1	friso	wheel	20B	29 mei 10:58 i-am.gz

friso@fvv:/tmp/data \$

```
friso@fvv:/tmp/data $ ls
total 8
-rw-r--r--  1 friso  wheel    0B 29 mei 10:57 i-am-void.gz
-rw-r--r--  1 friso  wheel   20B 29 mei 10:58 i-am.gz
friso@fvv:/tmp/data $ gunzip -c i-am.gz
friso@fvv:/tmp/data $
friso@fvv:/tmp/data $
friso@fvv:/tmp/data $ gunzip -c i-am-void.gz

gzip: i-am-void.gz: unexpected end of file
friso@fvv:/tmp/data $
```



p

Þ



character	Þ	þ
Unicode name	LATIN CAPITAL LETTER THORN	LATIN SMALL LETTER THORN
Unicode	00DE	00FE
Character entity reference	Þ	þ
Windows-1252, ISO-8859-1, ISO-8859-15	DE	FE
LaTeX	\TH	\th

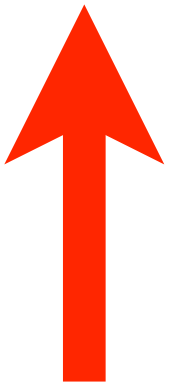
TSV ==

thorn separated values?

p == 0xFE

or -2, in Hive

```
CREATE TABLE browsers (  
    browser_id STRING,  
    browser STRING  
) ROW FORMAT DELIMITED FIELDS TERMINATED BY '-2';
```



WIKIPEDIA
The Free Encyclopedia

[Main page](#)

Contents

Featured content

Current events

Random article

[Donate to Wikipedia](#)

▼ Interaction

[Help](#)

[About Wikipedia](#)

Community portal

Recent changes

[Contact Wikipedia](#)

► **Toolbox**

► [Print/export](#)

Article

Talk

Read

Edit

[View history](#)

Search

Data governance

From Wikipedia, the free encyclopedia

Data governance is an emerging discipline with an evolving definition. The discipline embodies a convergence of data quality, data management, data policies, business process management, and risk management surrounding the handling of data in an organization. Through data governance, organizations are looking to exercise positive control over the processes and methods used by their **data stewards** and **data custodians** to handle data.

Data governance is a set of processes that ensures that important data assets are formally managed throughout the enterprise. Data governance ensures that data can be trusted and that people can be made accountable for any adverse event that happens because of low data quality. It is about putting people in charge of fixing and preventing issues with data so that the enterprise can become more

Part of a series on

Governance

Models

Collaborative • Good •
Multistakeholder • Open-source •
Private

By level

Local • Global

By field

Climate • Clinical • Corporate • **Data** •
Earth system • Ecclesiastical •
Environmental • Higher education •
Information • Network • Ocean •
Political party • Project • Self •
Service-oriented architecture • Soil •
Technology • Transnational •
Website

Measures

W Master data management - x

en.wikipedia.org/wiki/Master_data_management

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Create account

👤 Log in



WIKIPEDIA
The Free Encyclopedia

[Main page](#)
[Contents](#)
[Featured content](#)
[Current events](#)
[Random article](#)
[Donate to Wikipedia](#)

▼ Interaction

[Help](#)
[About Wikipedia](#)
[Community portal](#)
[Recent changes](#)
[Contact Wikipedia](#)

► Toolbox

► Print/export

Article

Talk

Read

Edit

View history

Search

Master data management

From Wikipedia, the free encyclopedia



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In [computing](#), **Master Data Management (MDM)** comprises a set of processes, governance, policies, standards and tools that consistently defines and manages the [master data](#) (i.e. non-transactional data entities) of an [organization](#) (which may include [reference data](#)).

An MDM tool can be used to support Master Data Management by removing duplicates, standardizing data (Mass Maintaining), incorporating rules to eliminate incorrect data from entering the system in order to create an authoritative source of master data. Master data are the products, accounts and parties for which the business transactions are completed. The root cause problem stems from business unit and product line segmentation, in which the same customer will be serviced by different product lines, with redundant data being entered about the customer (aka party in the role of customer) and account in order to process the transaction. The redundancy of party and account data is compounded in the front to back office life cycle, where the authoritative single source for the party, account and product data is needed but is often

W Meta-data management

en.wikipedia.org/wiki/Meta-data_management

Create account Log in

Article

Talk

Read

Edit

View history

Search



WIKIPEDIA
The Free Encyclopedia

[Main page](#)
[Contents](#)
[Featured content](#)
[Current events](#)
[Random article](#)
[Donate to Wikipedia](#)

Interaction

[Help](#)
[About Wikipedia](#)
[Community portal](#)
[Recent changes](#)
[Contact Wikipedia](#)

Toolbox

[Print/export](#)

Meta-data management

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This article **may be too technical for most readers to understand**. Please help [improve](#) this article to [make it understandable to non-experts](#), without removing the technical details. The [talk page](#) may contain suggestions.

(January 2013)

Meta-data management (also known as [metadata](#) management, without the hyphen) involves storing [information](#) about other information. With different types of [media](#) being used, references to the location of the data can allow management of diverse repositories.

Metadata management can be defined as the end-to-end process and governance framework for creating, controlling, enhancing, attributing, defining and managing a metadata schema, model or other structured aggregation system, either independently or within a repository and the associated supporting processes (often to enable the management of content).

[URLs](#), images, video etc. may be referenced from a triples table of object, attribute and value.

With specific [knowledge domains](#), the boundaries of the metadata for each must be managed, since a general [ontology](#) is not useful to experts in one field whose language is knowledge-

W Data custodian – Wikipedia x


en.wikipedia.org/wiki/Data_custodian

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☆

🔑

☰



WIKIPEDIA
The Free Encyclopedia

Main page

Contents

Featured content

Current events

Random article

Donate to Wikipedia

Interaction

Help

About Wikipedia

Community portal

Recent changes

Contact Wikipedia

Toolbox

Print/export

Create account

Log in

Article

Talk

Read

Edit

View history

Search

Data custodian

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This article includes a [list of references](#), but **its sources remain unclear because it has insufficient [inline citations](#)**. Please help to [improve](#) this article by [introducing](#) more precise citations. *(August 2010)*

In [Data Governance](#) groups, responsibilities for data management are increasingly divided between the business process owners and information technology (IT) departments. Two functional titles commonly used for these roles are [Data Steward](#) and Data Custodian.

Data Stewards are commonly responsible for data content, context, and associated business rules. Data Custodians are responsible for the safe custody, transport, storage of the data and implementation of business rules.^{[1][2]} Simply put, Data Stewards are responsible for what is stored in a data field, while Data Custodians are responsible for the technical environment and database structure. Common job titles for data custodians are Database Administrator (DBA), Data Modeler, and ETL Developer.


Contents

[show]

W Data steward – Wikipedia, x

en.wikipedia.org/wiki/Data_steward

Create account Log in



WIKIPEDIA
The Free Encyclopedia

Main page

Contents

Featured content

Current events

Random article

Donate to Wikipedia

Interaction

Help

About Wikipedia

Community portal

Recent changes

Contact Wikipedia

Toolbox

Print/export

ArticleTalkReadEditView historySearch

Data steward

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In [metadata](#), a **data steward** is a person that is responsible for maintaining a [data element](#) in a [metadata registry](#). A data steward may share some responsibilities with a [data custodian](#).

Data stewardship roles are common when organizations are attempting to exchange data precisely and consistently between computer systems and reuse data-related resources. [Master data management](#) often makes references to the need for data stewardship for its implementation to succeed.

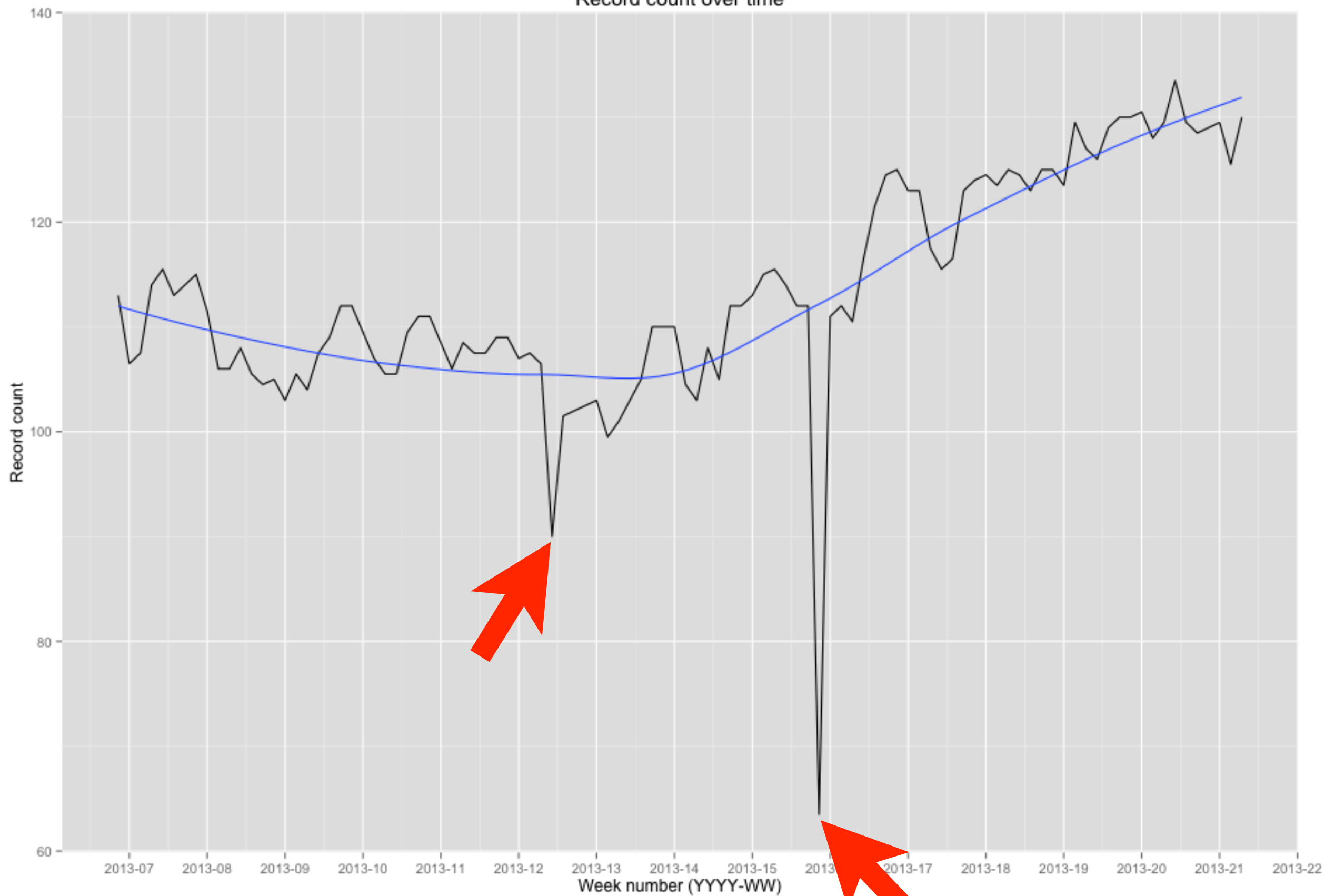
Contents [show]

Data Steward Responsibilities [edit]

A data steward ensures that each assigned data element:

1. Has clear and unambiguous [data element definition](#).
2. Does not conflict with other data elements in the metadata registry (removes duplicates, overlap etc.)
3. Has clear enumerated value definitions if it is of type [Code](#).

Record count over time



- The format will change
- Faulty deliveries will occur
- Your parser will break
- Records will be mistakingly produced (over-logging)
- Other people test in production too (and you get the data from it)
- Etc., etc.

- Simple deployment of ETL code
- Scheduling
- Scalable
- Independent jobs
- Fixable data store
- Incremental where possible
- Metrics

Independent jobs

source (external)

HDFS upload + move in place

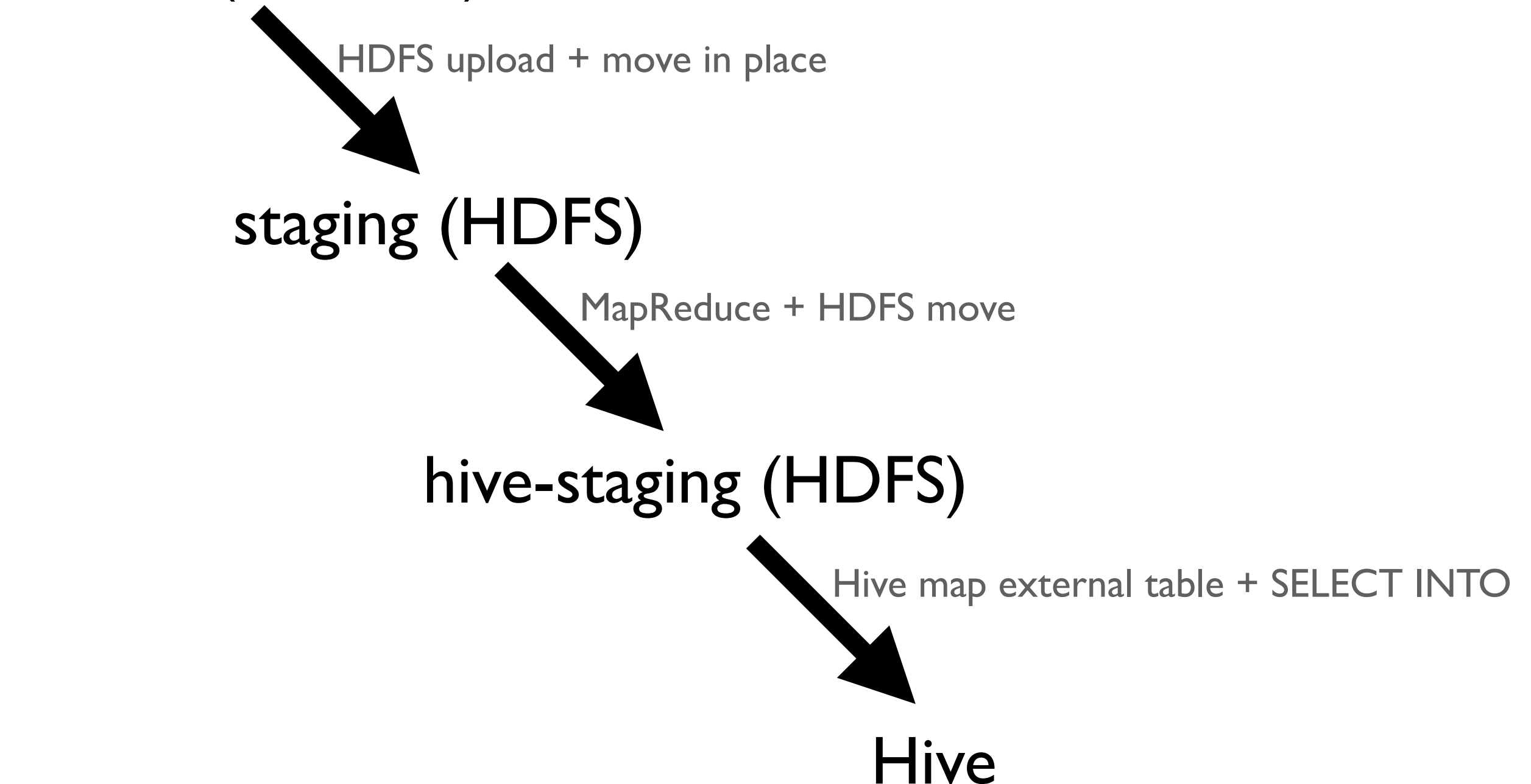
staging (HDFS)

MapReduce + HDFS move

hive-staging (HDFS)

Hive map external table + SELECT INTO

Hive



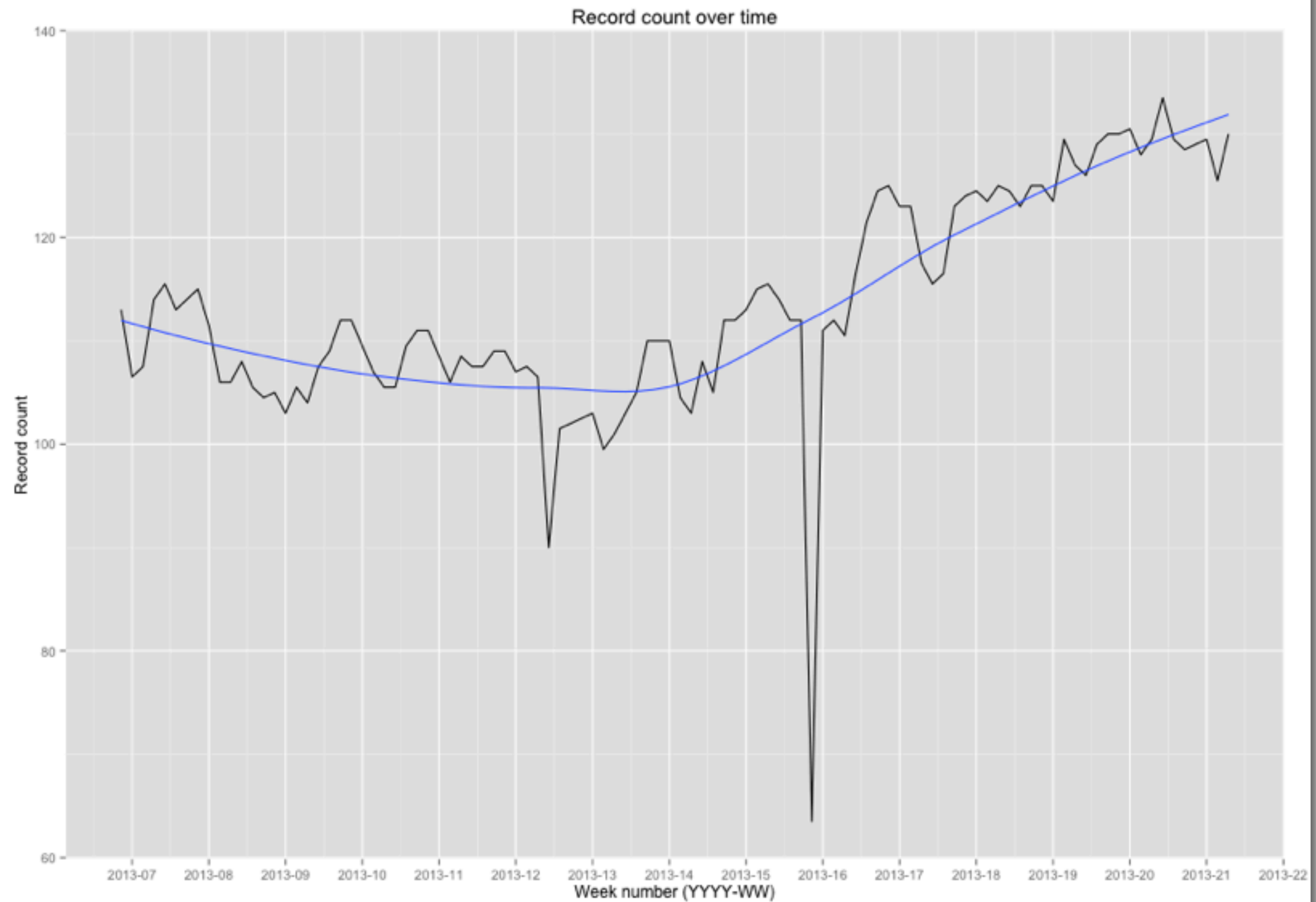
Out of order jobs

- At any point, you don't really know what 'made it' to Hive
- Will happen anyway, because some days the data delivery is going to be three hours late
- Or you get half in the morning and the other half later in the day
- It really depends on what you do with the data
- This is where metrics + fixable data store help...

Fixable data store

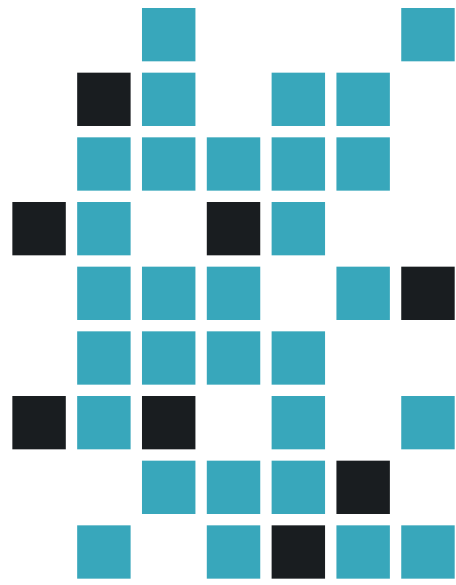
- Using Hive partitions
- Jobs that move data from staging create partitions
 - When new data / insight about the data arrives, drop the partition and re-insert
 - Be careful to reset any metrics in this case
- Basically: instead of trying to make everything transactional, repair afterwards
- Use metrics to determine whether data is fit for purpose

Metrics



Metrics service

- Job ran, so may units processed, took so much time
 - e.g. 10GB imported, took 1 hr
 - e.g. 60M records transformed, took 10 minutes
- Dropped partition
- Inserted X records into partition



GoDataDriven

We're hiring / Questions? / Thank you!

Friso van Vollenhoven
CTO

@fzk
frisovanvollenhoven@godatadriven.com