Scale your data application with Apache Mahout





Isabel Drost

Daytime:

Co-Founder Berlin Buzzwords. Software developer at Nokia Gate 5 GmbH.

Nighttime:

Co-Founder Apache Mahout. Member Apache Software Foundation. Founder of Berlin Hadoop Get Together.



Hello GeeCon visitors.

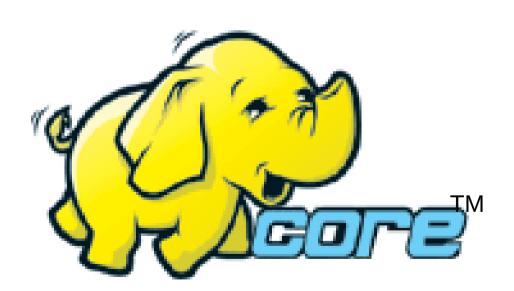
Apache Hadoop

Know it?

Use it?

How many nodes?

Contributed patches?



Apache Lucene/ Solr



Apache Mahout





Data-based approach



Find requirements from past users' behaviour



Users seldom give explicit feedback.

Take a snapshot of user interactions.

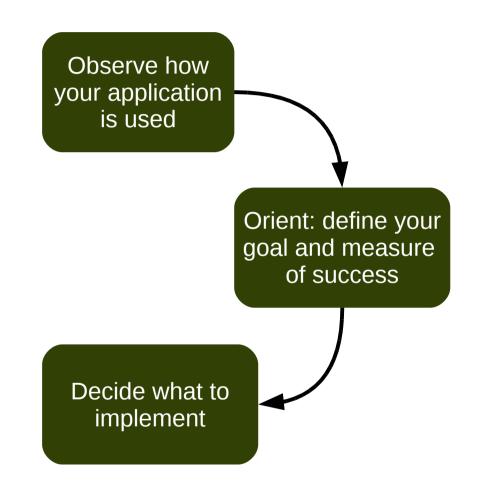
Analyze what they do.

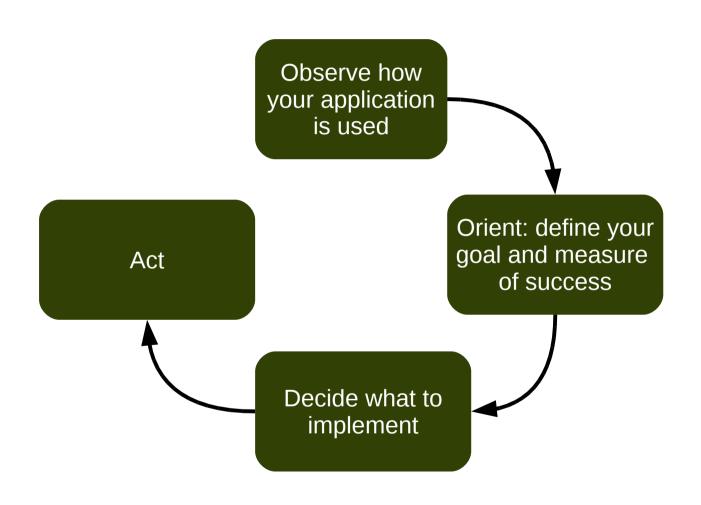
Derive needs for new functionality from that.

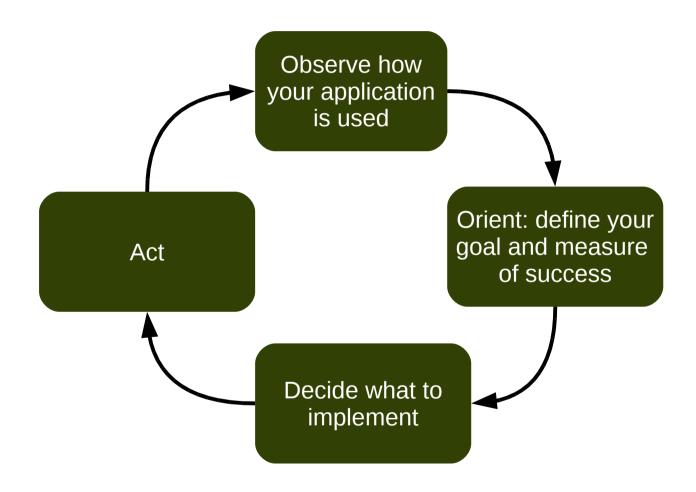
Observe how your application is used

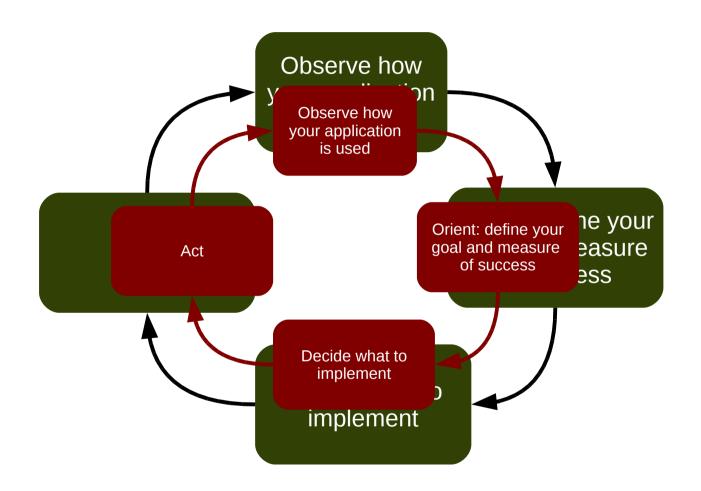
Observe how your application is used

Orient: define your goal and measure of success









Develop new features that rely on user input



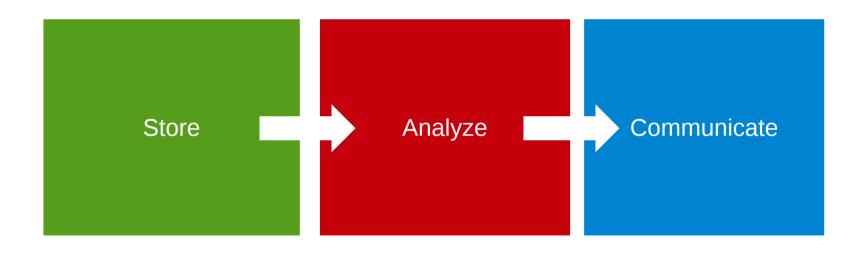
Recommend places based on my friends' preferences

Show content on site based on what I clicked and read

Automatically identify the important mails in my inbox

Discover new blogs based on what I read

From grouping and counting to machine learning







Extracting information from log files

- Access logs.
- · Health check results.
- Response time logs.

New requirements:

- Predict traffic for machine sizing
- Harden setup against intrusion attempts
- Analyze outages for future prevention

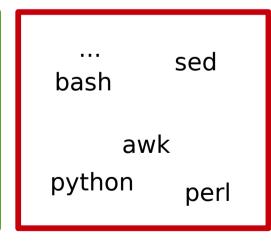
Data based features:

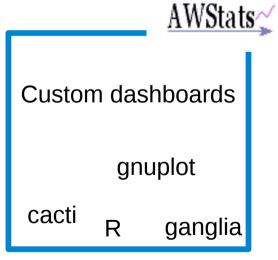
- Show only content I have not seen yet
- Show different content based on region
- Show content I like based on click stream

Extracting information from log files

- Access logs.
- Health check results.
- Response time logs.

Your favourite log file format Some stuff in databases







Structured relational data

- Attendee database.
- Speaker information.
- User transactions.

New requirements:

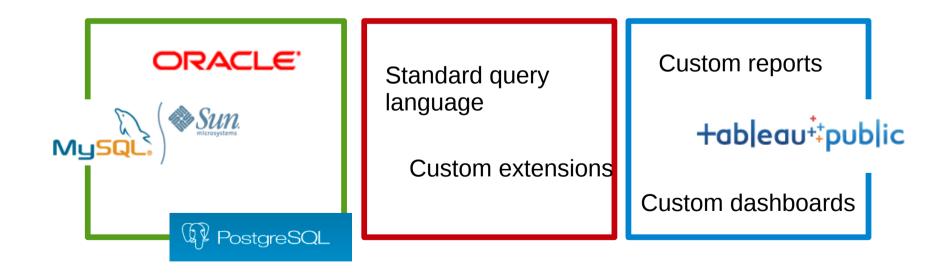
- Missing audience.
- Define lunch menu.
- Travel budget.

Data based features:

- Show selected content based on age.
- Recommendation of talks based on explicit topics of interest.

Structured relational data

- Attendee database.
- Speaker information.
- User transactions.







Java API Pipes C++ API Streaming Dumbo for Python

and use standard tools.

Use custom visualization.

Export much smaller

result set to database

Export to file format compatible with your favourite graphing tool.





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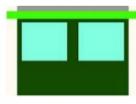
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Chaos CC

Schlagworter

Auch aktueller Staatstrojaner rechtswidrig

Dem Chaos Computer Club (CCC) ist eine «noch fast fabrikneue» Version des umstrittenen Staatstrojaners zugespielt worden.

Berlin (dpa) - Dem Chaos Computer Club (CCC) ist eine «noch fast fabrikneue» Version des umstrittenen Staatstrojaners zugespielt worden. Eine Analyse des Programmcodes habe ergeben, dass die Spionage-Software weiterhin für rechtswidrige Aktionen eingesetzt werden könne, erklärte der Club am Mittwoch.

Anzeige

Wo die Software eingesetzt wurde, blieb zunächst offen. Das Bundesinnenministerium dementierte den Einsatz für die ihm unterstellten Behörden, das sind Bundeskriminalamt (BKA), Bundesverfassungsschutz und Bundespolizei. Vor zweieinhalb Wochen hatte der CCC eine erste Trojaner-Software zum Abhören

BKA Bundeskriminalamt Bundespolizei Bundesverfassungsschutz CCC Chaos Computer Club Innenausschuss Kommunikation Trojaner

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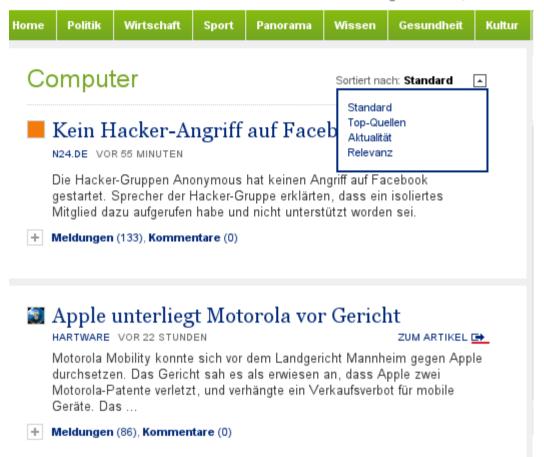
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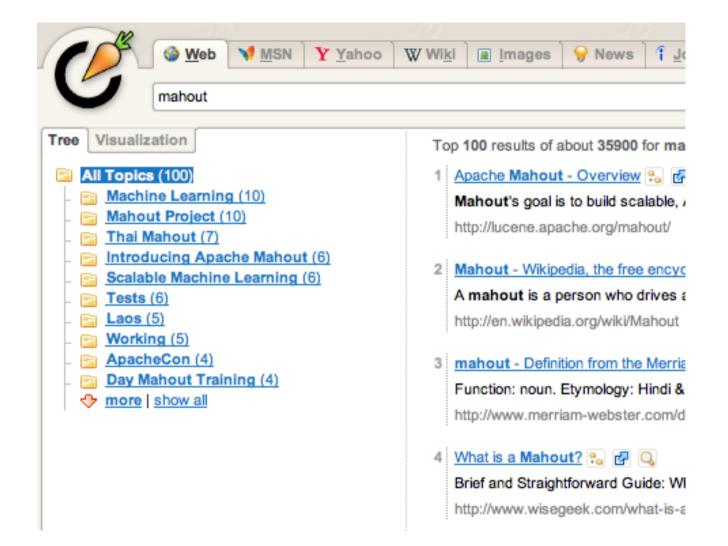
KANO (Reuters) - Nigerian security forces said on Sunday they were searching for Islamist militants behind a coordinated attack in the north that killed at least 65 people, as residents still in shock demanded the government do more to protect them.



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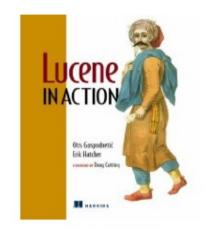




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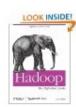
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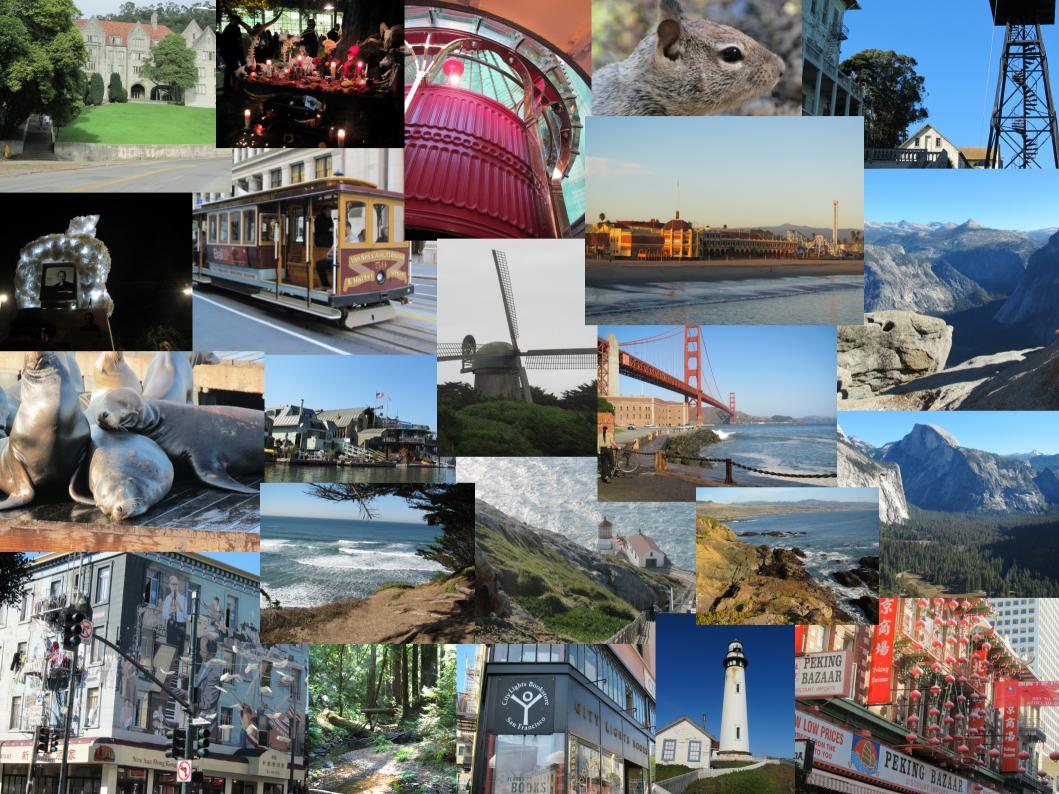


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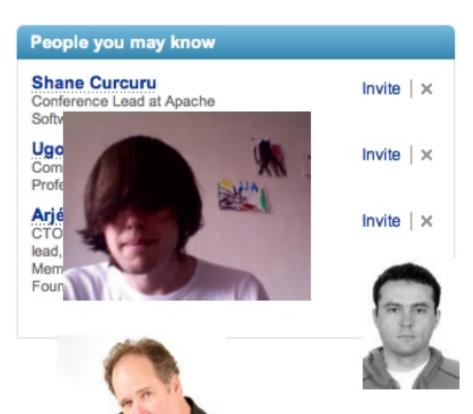


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Recommending people













Problems

- Often unstructured, non-relational data.
- No simple, well defined rules for prediction.
- Pattern search too tedious for humans.

Machine learning – what's that?



Image by John Leech, from: The Comic History of Rome by Gilbert Abbott A Beckett.

Bradbury, Evans & Co, London, 1850s

Archimedes taking a Warm Bath

Archimedes model of nature

$$\frac{Density of Object}{Density of Fluid} = .$$

Weight

 $Weight-Apparent\ immersed\ weight$

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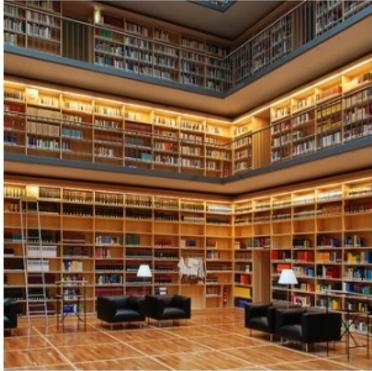
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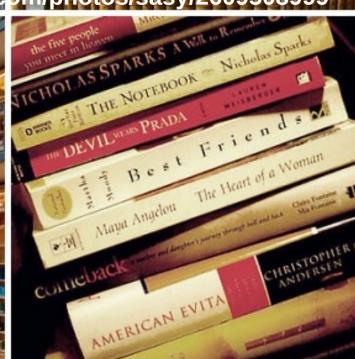
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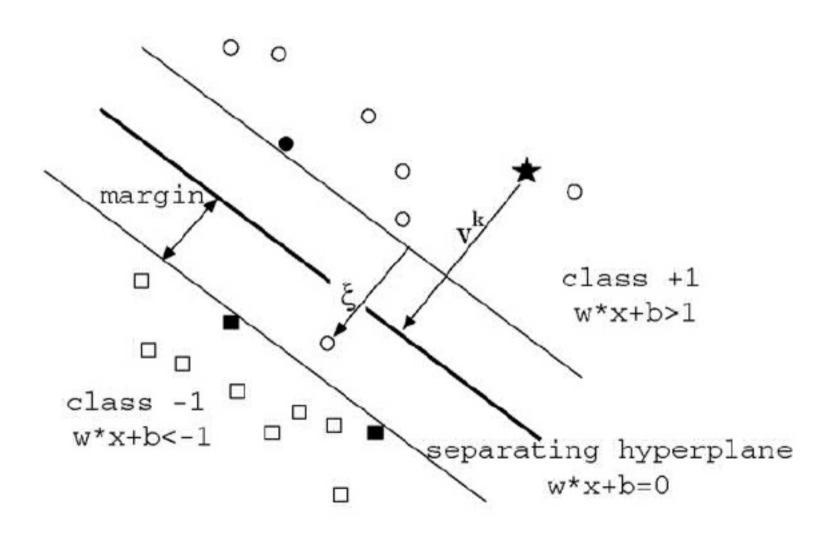
June 25, 2008 by chase-me







An SVM's model of nature



The challenge

Mission

Provide scalable data mining algorithms.











Sebastian Schelter Jake Mannix **Benson Margulies Robin Anil David Hall** AbdelHakim Deneche Karl Wettin Sean Owen **Grant Ingersoll** Otis Gospodnetic **Drew Farris** Jeff Eastman **Ted Dunning Isabel Drost** And many more



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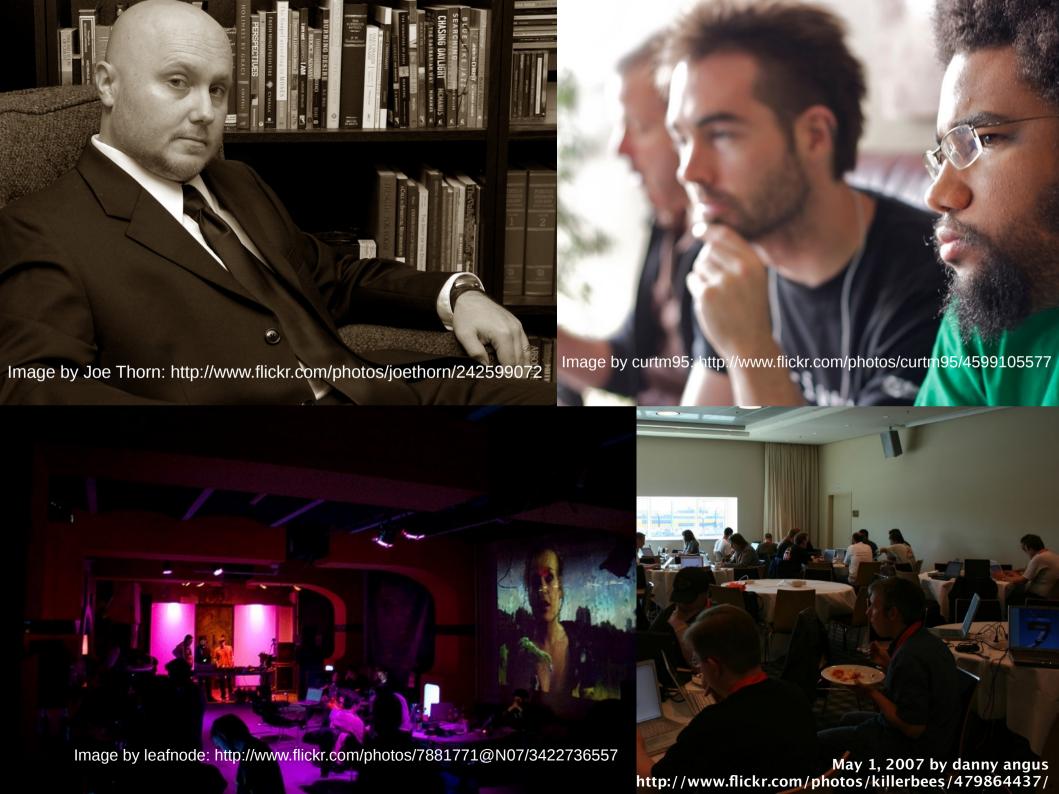






Emeritus:

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Pieces in a machine learning project

Model

Instance*

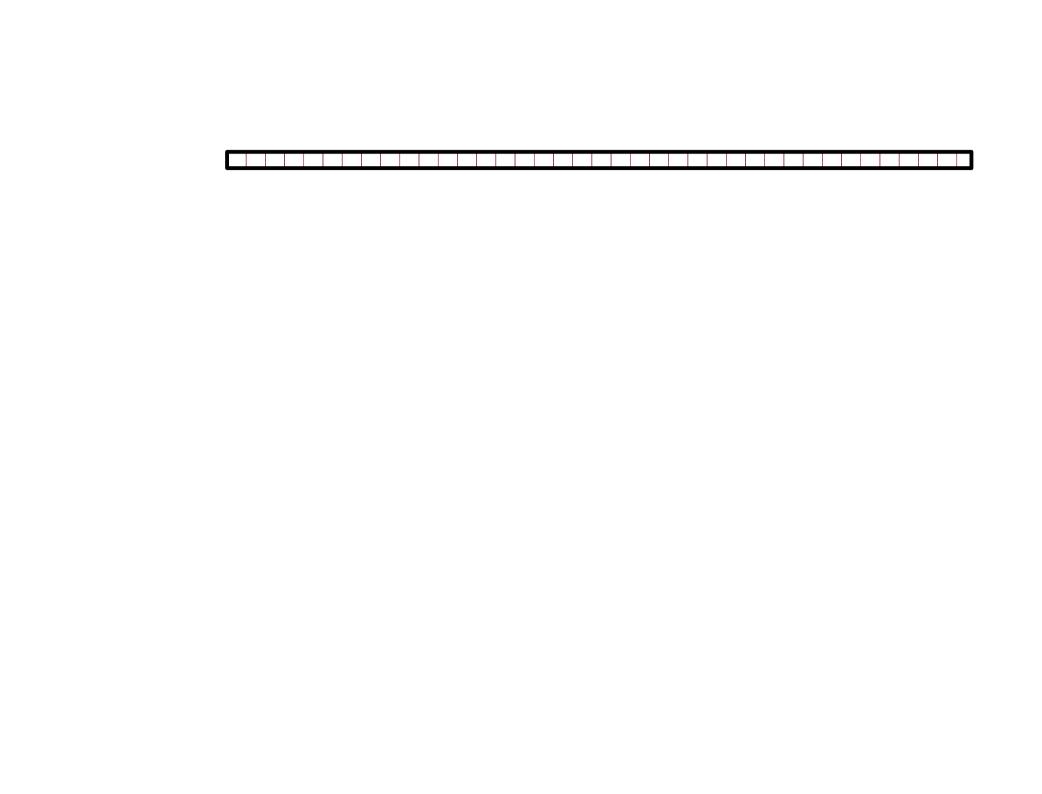
(sometimes also called example, or item)

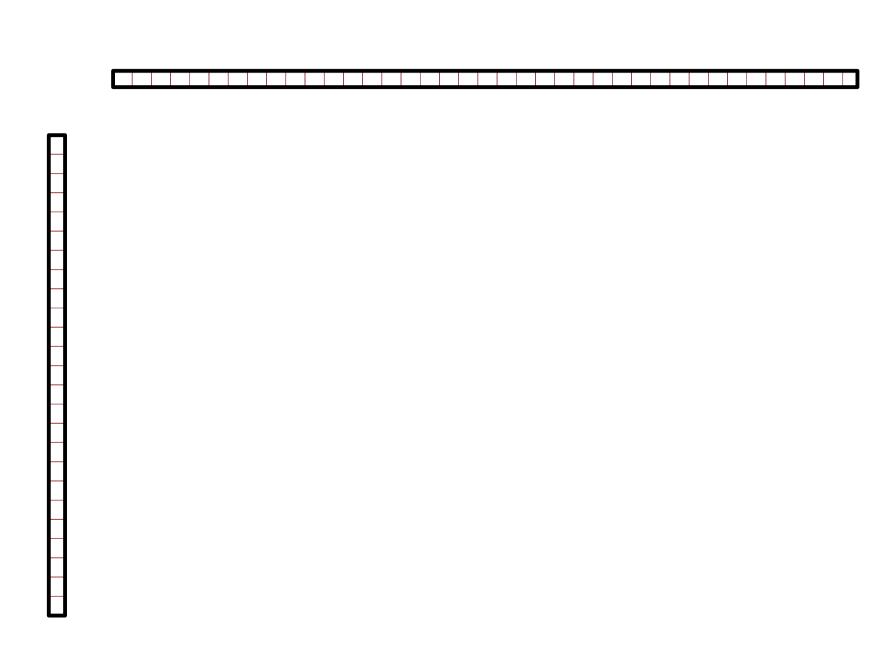
Feature*

(sometimes also called attribute or signal)

Label*

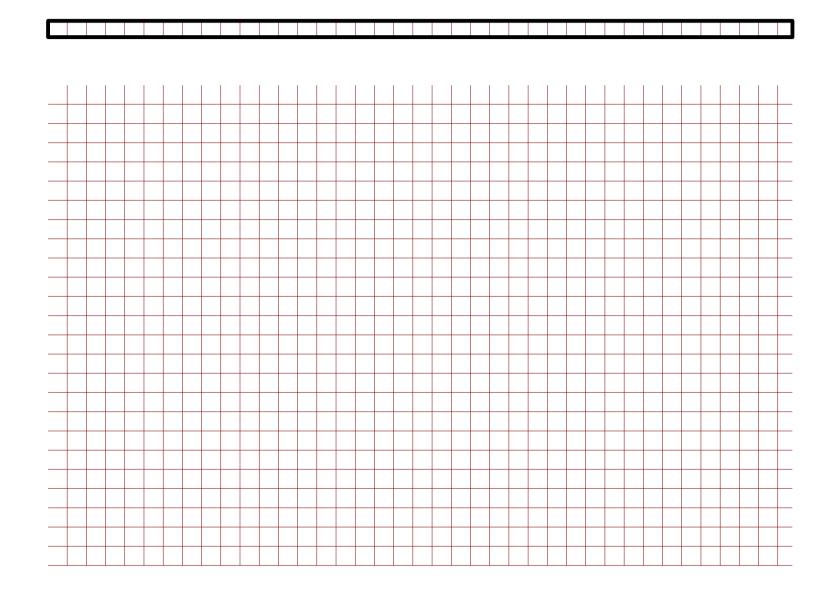
(sometimes also called class, target variable)

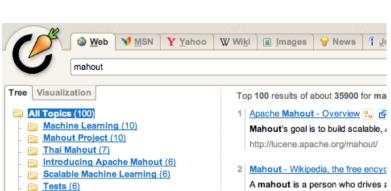






Learning problems in context





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http://en.wikipedia.org/wiki/Mahout

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4 What is a Mahout? 🛼 🚱 🔍

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Reuters - Andrew Hammond - 2 hours ago

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Al-Qaida linked group claims Baghdad attacks The Associated Press

Aljazeera.net - BBC News - Sky News - Washington Post - Wikipedia: 25 October 2009

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US President Barack Obama has said he will "never rush" a decision to send more troops to Afghanistan, as he comes under pressure to set out a new policy.

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Obama refuses to rush troops decision ABC Online Pouters India - The Associated Press - AFP

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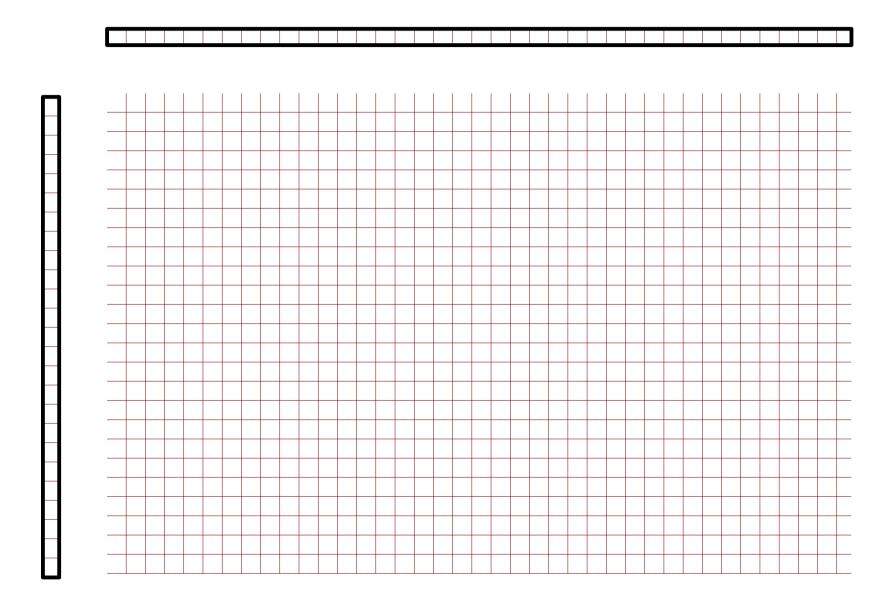
The genocide and war crimes trial of former Bosnian Serb leader Radovan Karadzic is due to resume in The Hague, a day after it was adjourned.

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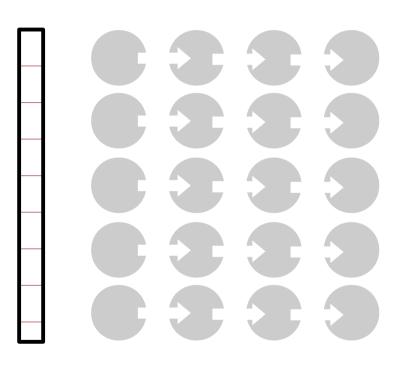


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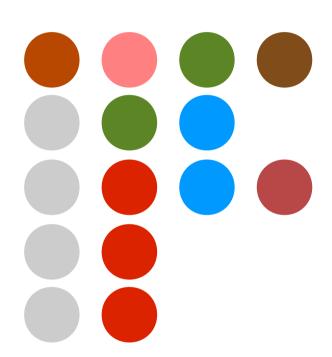


#20 of the Oakland 467 x 594 - 86k zimbio.com





The HDFS filesystem is not restricted to MapReduce jobs. It can be used for other applications, many of which are under way at Apache. The list includes the HBase database, the Apache Mahout machine learning system, and matrix operations.















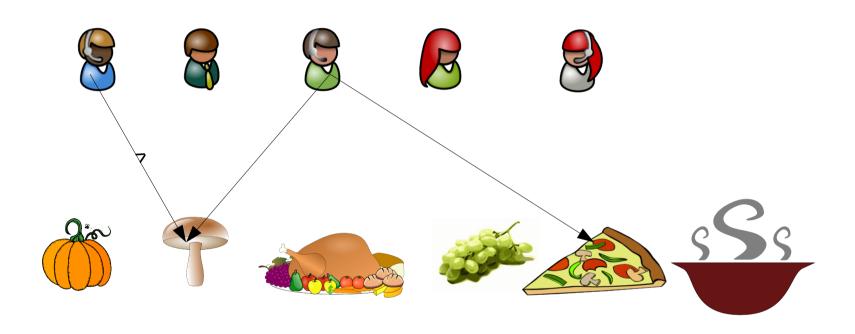


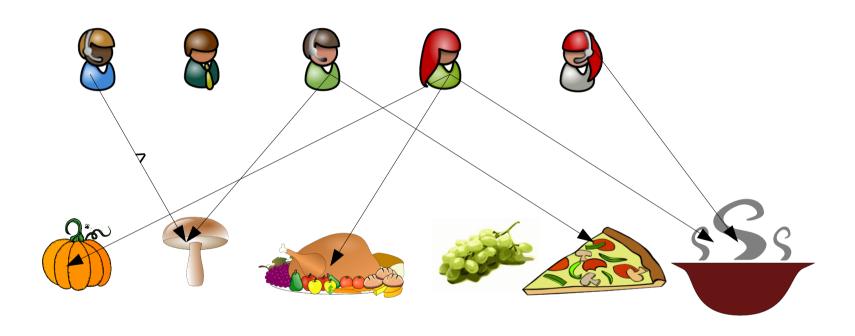


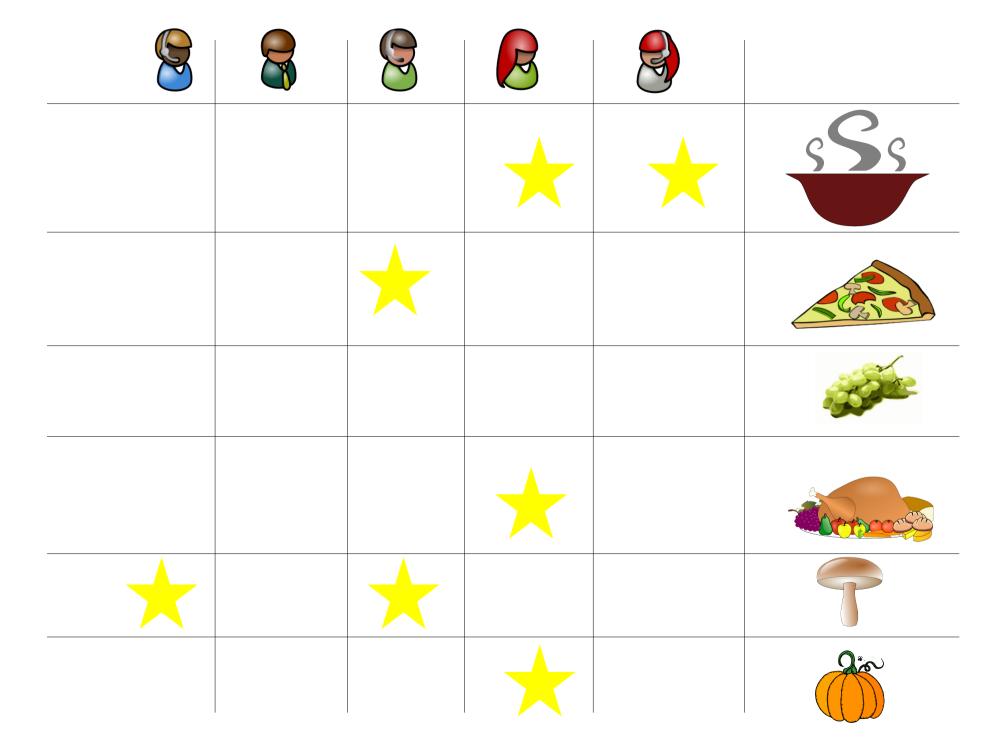














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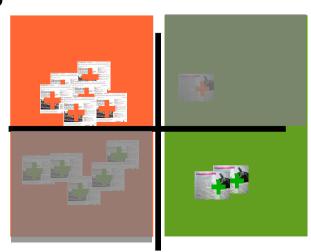
Data volume Static core user data User User transactions actions External data Data quality



Accuracy

$$ACC = \frac{true\ positive + true\ negative}{true\ positive + false\ positive + false\ negative + true\ negative}$$

- Problems:
 - What if class distribution is skewed?

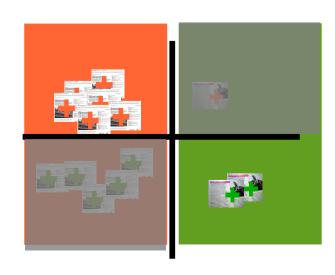


Precision/ Recall

$$Precision = \frac{true\ positive}{true\ positive + false\ positive}$$

$$Recall = \frac{true\ positive}{true\ positive + false\ negative}$$

- Problem:
 - Depends on decision threshold.

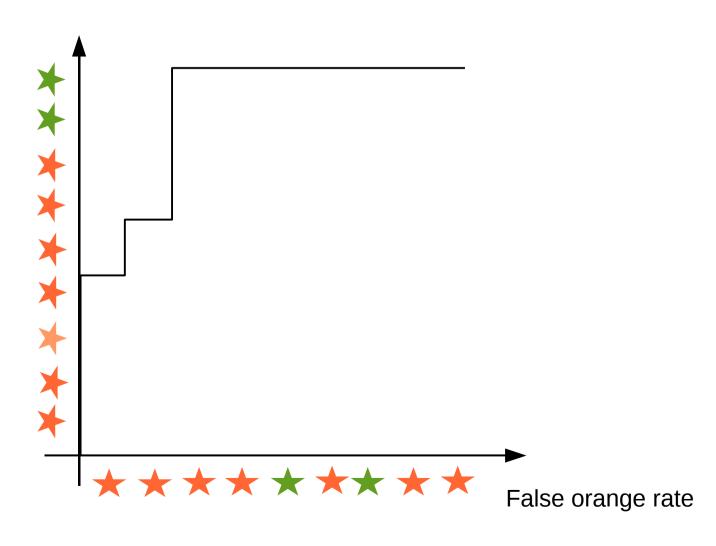


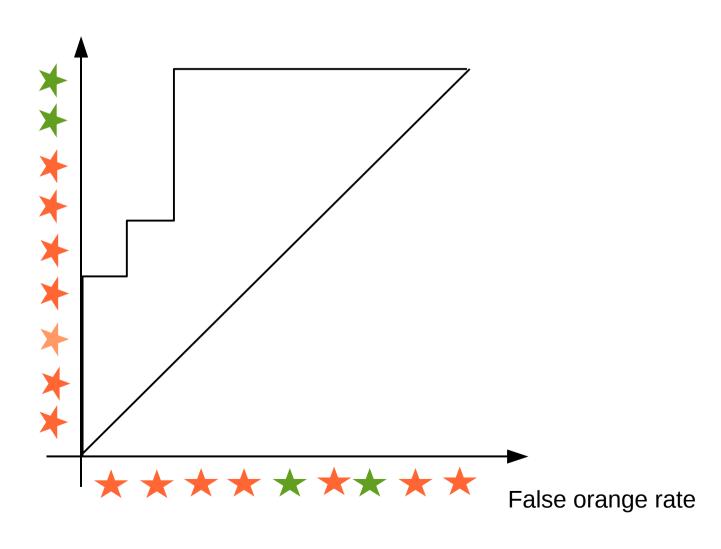




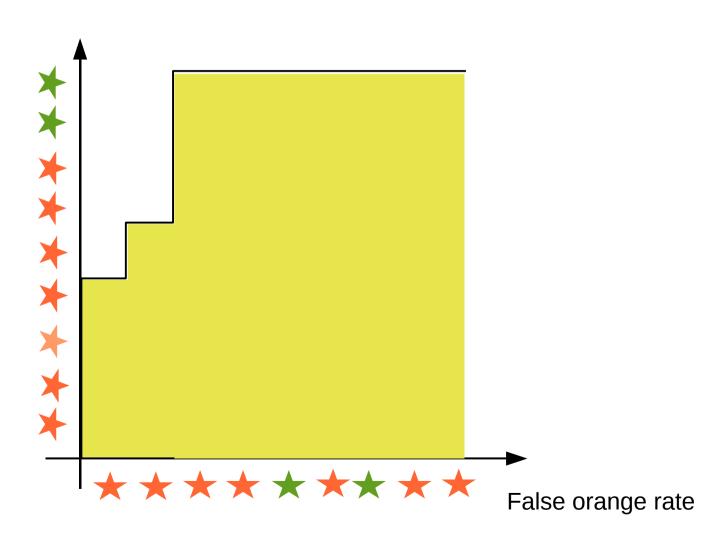


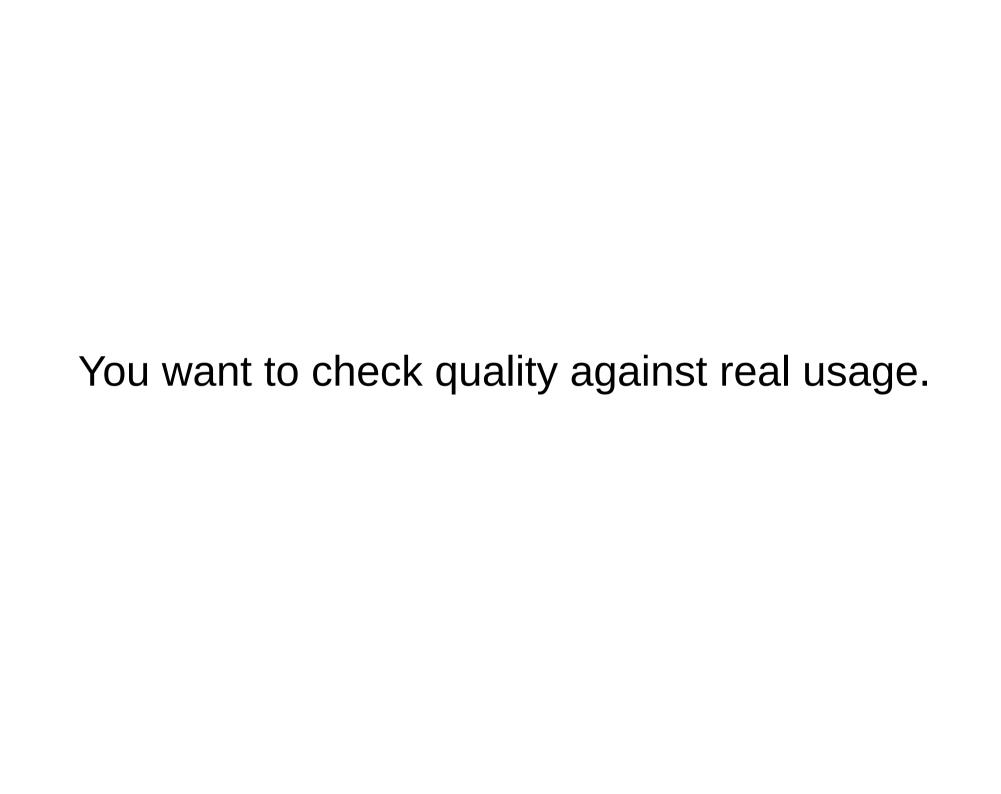


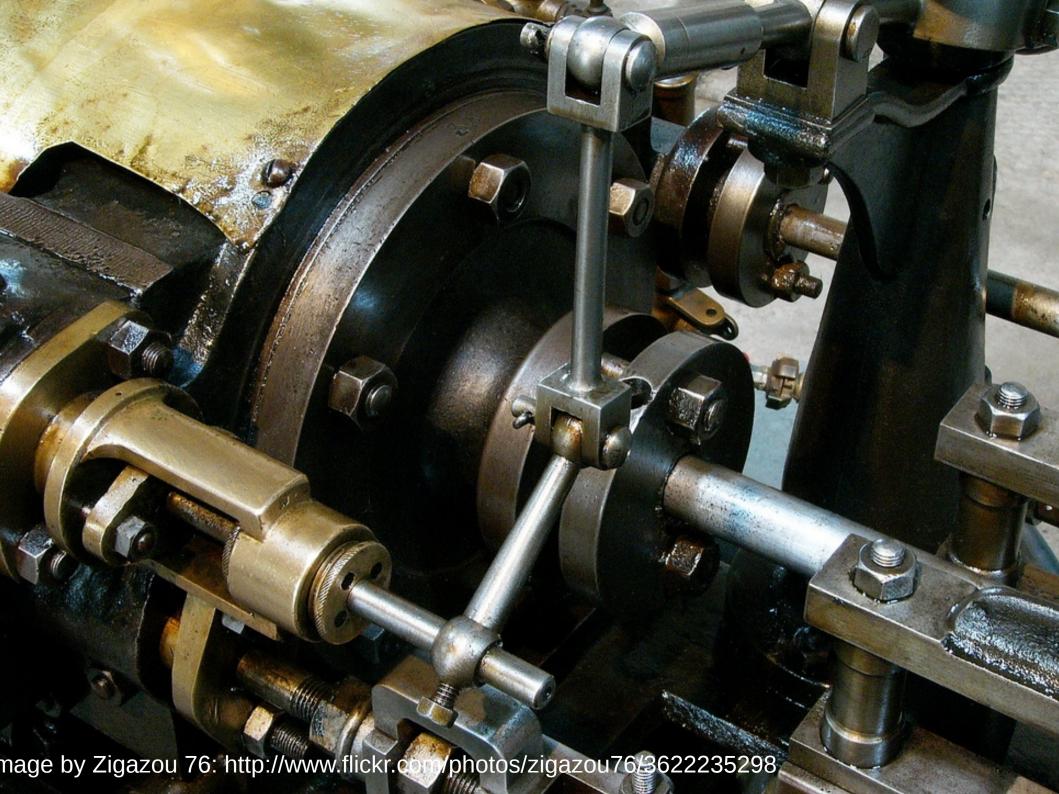


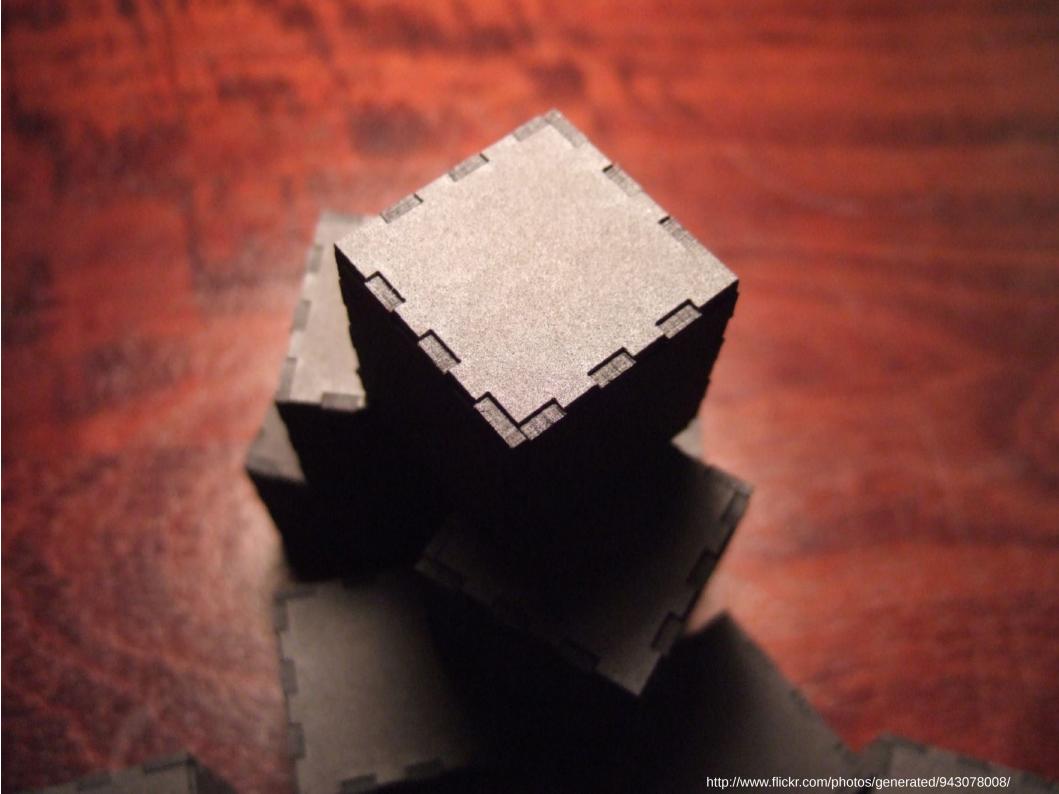


AUC – area under ROC

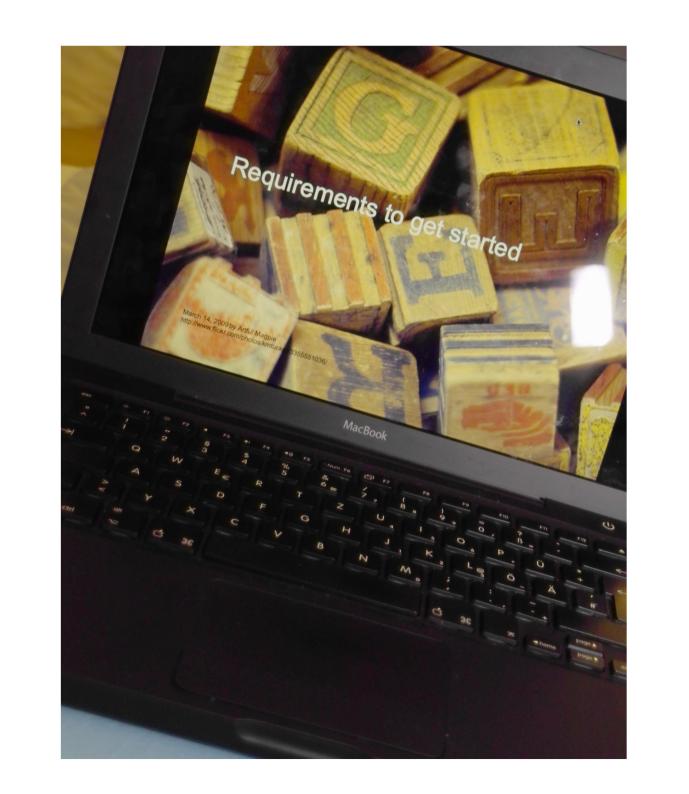








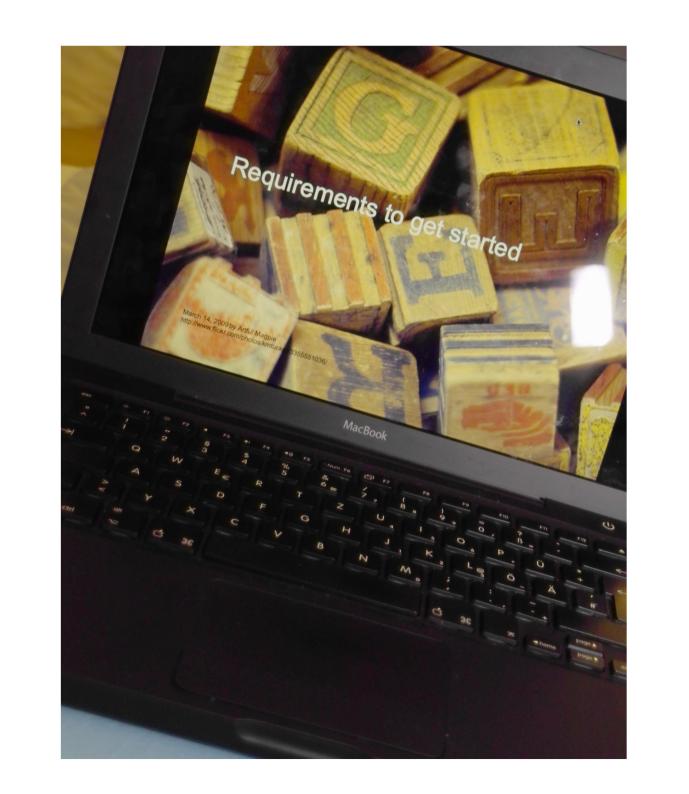








(Thanks to Thilo for helping set up the cluster, Thanks to packet and masq for two of the three machines.)











WARNING





user@mahout.apache.org dev@mahout.apache.org



Image by: Patrick McEvoy

Interest in solving hard problems.

Being part of lively community.

Engineering best practices.

Bug reports, patches, features. Documentation, code, examples.



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Image by: Patrick McEvoy

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New requirements:

- Find deficiencies in online reviews
- Find preferred features online

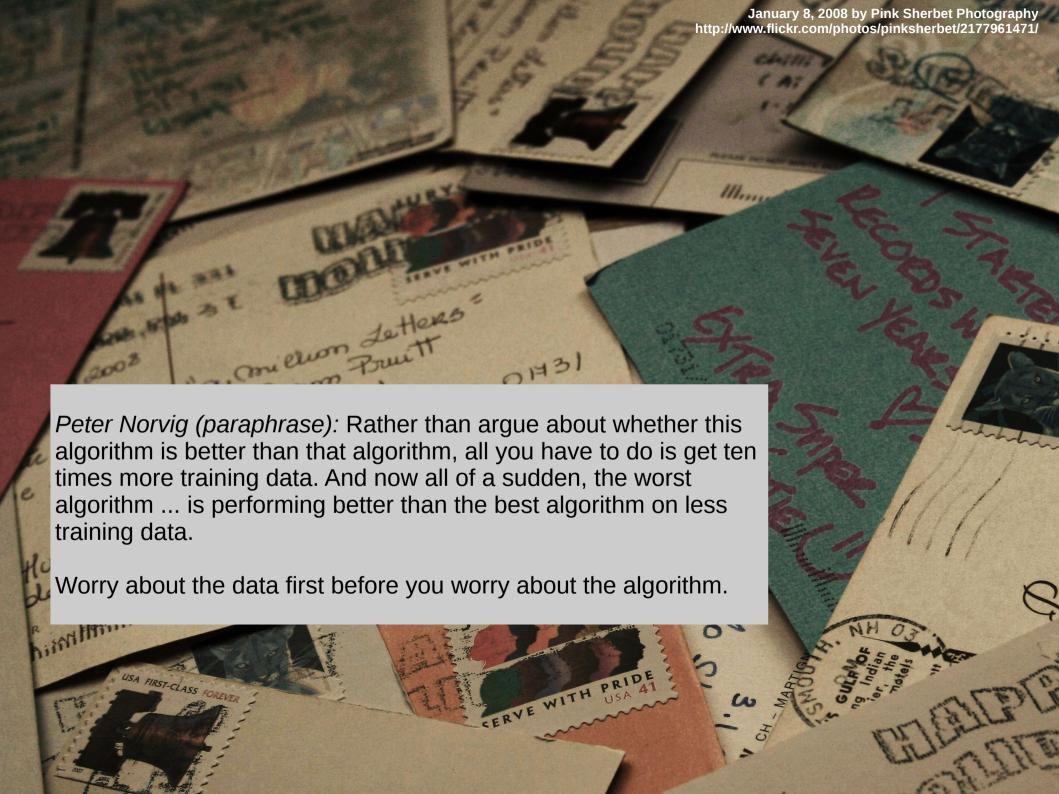
Data based features:

- Link to external content.
- Show what I'm interested in based on my social network.







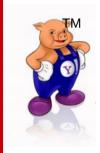






Java API Pipes C++ API Streaming Dumbo for Python

•••





Cascading

Export much smaller result set to database and use standard tools.

Use custom visualization.

Export to file format compatible with your favourite graphing tool.

