

Lucid
IMAGINATION

Open.
Scalable.
Intelligent?

Thinking Lucene ▼ Think Lucid.

Unstructured Free Mind
Too **Open Source**
Ended For Business

Unstructured Data

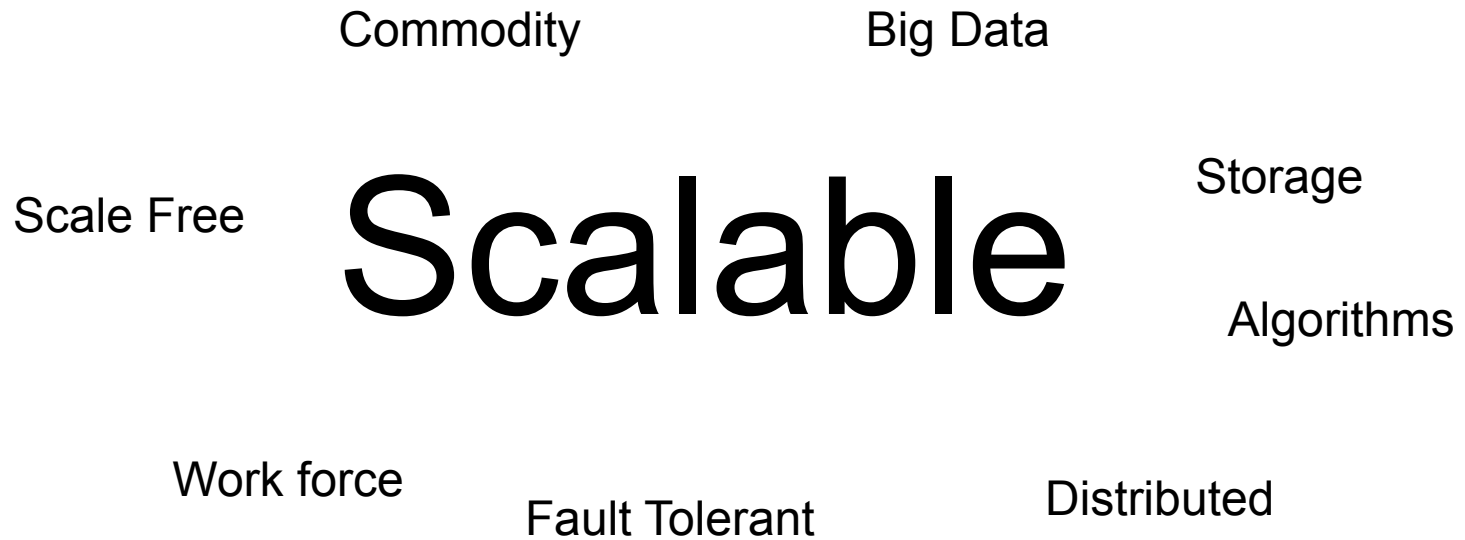
- ▼ Some estimate (pre-Twitter!) as much as 85% of all data is unstructured
 - ▼ Much of it is text
- ▼ How well you deal with unstructured data is often the difference maker for an organization
- ▼ Is there really such a thing as “pure” unstructured data?



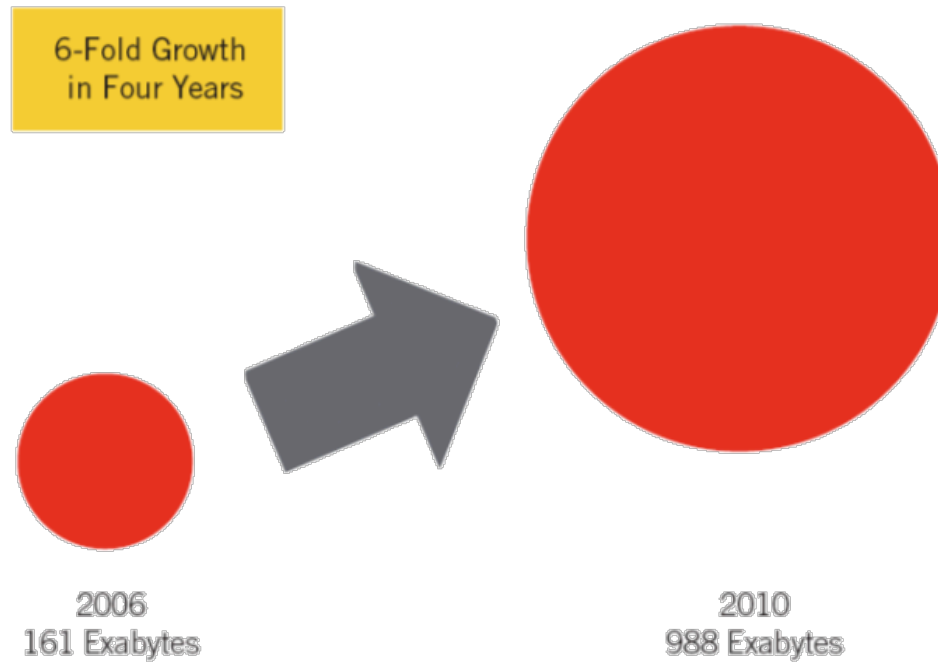
Cascading



All marks are property of their respective owners



Information Created, Captured and Replicated



<http://www.emc.com/collateral/analyst-reports/diverse-exploding-digital-universe.pdf>

We've gotten good at...

Data

+



and friends

= Open,
Scalable
Search

The Future is Bright for Scalability

- ▶ New Lucene capabilities will give even more control over indexing and searching to allow for exacting control over footprint
- ▶ Solr Cloud efforts are integrating ZooKeeper with Solr to make it even easier to manage a large scale Lucene/Solr installation
 - ▶ <http://wiki.apache.org/solr/SolrCloud>
- ▶ Solr + Hadoop makes it easier to index large scale content

We've also gotten good at...



Find Organize Discover Associate
Collective Personalization
Sentiment **Intelligent?** Semantics
Learn Plan
Knowledge Understand
Reason Solve Problems

Why Should I care?

- ▼ Storage, CPU, Memory, Network, Racks, Data Centers, Bandwidth are all commodities
- ▼ As are:
 - ▼ Search Algorithms
 - ▼ Distributed Computing Paradigms
- ▼ Open source and scalability demands accelerate commoditization
- ▼ Intelligence (artificial and human) is in short supply
- ▼ Machine learning can help

Data

+



and others



and friends

=

Open,
Scalable,
Intelligent
Applications

**What can you do right
now to add
intelligence?**

Adding Intelligence

- ▼ Tip of the Iceberg
- ▼ Recommendations
- ▼ Organization
- ▼ Discovery
- ▼ Voice of the Users
- ▼ Location Aware
- ▼ Make the problem more manageable

Recommendations

- Online and Offline Recommendation capabilities available

- User-User
- Item-Item
- Many different ways to model

Customers Who Bought This Item Also Bought



The screenshot shows two recommended books. On the left is 'Pattern Recognition and Machine Learning' by Christopher M. Bishop, priced at \$58.86 with a 4.5-star rating from 41 reviews. On the right is 'The Elements of Statistical Learning' by T. Hastie, priced at \$75.17 with a 4.5-star rating from 27 reviews. A blue arrow icon is visible on the left side of the recommendation area.

- Map/Reduce Ready recommenders available

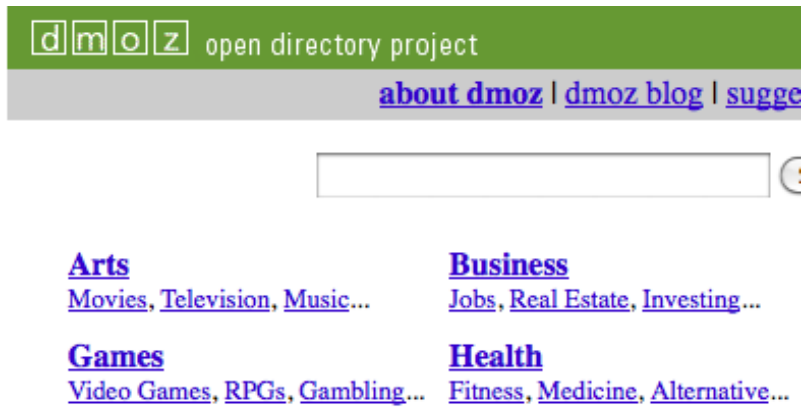
- Co-occurrence, pseudo
- Crude EC2 Estimated Cost: \$0.01/1000 recommendations*

* Courtesy Sean Owen



Organization

- Tag/label classify your content into predetermined categories
 - Bayesian and Complementary
 - Random Forests
- Identify Topics
 - Latent Dirichlet Allocation
- All Map/Reduce enabled



Discovery (Mahout)

- ▼ Group unseen content via clustering
 - ▼ K-Means, Dirichlet, Canopy, etc.
- ▼ Frequent Pattern Mining
 - ▼ Mine your logs for commonly co-occurring patterns
 - ▼ <http://www.slideshare.net/hadoopusergroup/mail-antispam>
- ▼ Collocations
 - ▼ Find statistically interesting word co-occurrences (i.e. phrases)
- ▼ All Map/Reduce enabled
- ▼ <http://cwiki.apache.org/MAHOUT/algorithms.html>



Discovery (Lucene/Solr)

- ▼ Faceting/Drill Downs and other UI summarization
- ▼ Auto complete/suggest
 - ▼ <https://issues.apache.org/jira/browse/SOLR-1316>
- ▼ Spell Checking
- ▼ More Like This and relevance feedback
- ▼ Document and Search Result (Carrot²) clustering



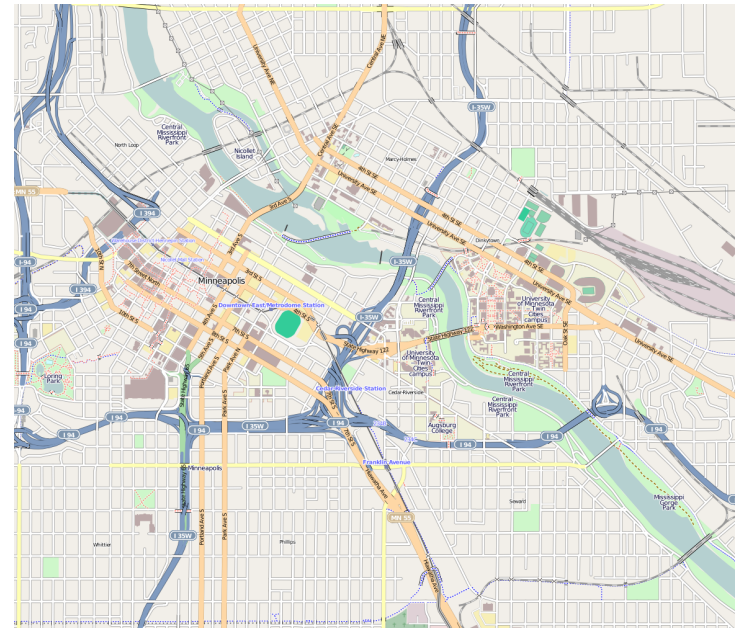
Share their joys, feel their pain

- ▼ Understand the voice of the user
- ▼ Sentiment Analysis
- ▼ Social Network Analysis
- ▼ Log Analysis
- ▼ Feedback loops



Location, Location, Location!

- ▶ Providing location aware search results can significantly enhance/reduce the search space for users
- ▶ Needs
 - ▶ Query Parsing
 - ▶ Filtering
 - ▶ Boosting
 - ▶ Sorting
 - ▶ Other



<http://www.openstreetmap.org/?lat=44.9744&lon=-93.2484&zoom=14&layers=B000FTFT>

Feature Reduction

- ▼ Curse of dimensionality!
- ▼ Singular Value Decomposition (SVD) is a powerful technique for reducing the dimensionality of large matrices while retaining the core features of the larger space
- ▼ Latent Semantic Analysis uses SVD to provide search over the reduced space
 - ▼ <http://github.com/algorithmic/lisa4solr>



Use Case: Enhanced Search

- ▶ Latent Semantic Analysis
- ▶ Add Collocations or Phrases to your content
- ▶ Classify/Cluster your Content
 - ▶ Named Entity Recognition, Sentiment analysis, Semantics
 - ▶ Facet/Filter
- ▶ Related Searches
- ▶ Spell Checking
- ▶ More Like This
- ▶ Clickstream Analysis

openNLP

hijk
stu x

GATE⁰¹¹

general architecture
for text engineering



Where next, Mahout?

- ▼ Recommenders
 - ▼ Restricted Boltzmann Machines
 - ▼ SVD-based
- ▼ Classifiers
 - ▼ Neural Network
 - ▼ Support Vector Machines
 - ▼ Stochastic Gradient Descent (logistic regression)
- ▼ Clustering
 - ▼ Eigen Cuts (spectral clustering)
- ▼ Common I/O Formats across algorithms
 - ▼ Avro?
- ▼ Visualization tools?
- ▼ Meta learners?

**Open.
Scalable.
Intelligent.**

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- ▼ <http://www.manning.com/ingersoll>