# INF3800/INF4800 Søketeknologi

2018.01.16

# Foreleser



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# Gruppelærer



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## Pensum



http://nlp.stanford.edu/IR-book/information-retrieval-book.html

# Øvinger



https://github.com/aohrn/inf3800-2018





https://piazza.com/uio.no/spring2018/inf38004800/home

# Introduksjon

## The Sweetspot



Information Retrieval Language Technology



## Web Search





Elvis Costello on MySpace Music - Free Streaming MP3s, Pictures MySpace Music profile for Elvis Costello. Download Elvis Costello Rock / / music singles watch music videos, listen to free streaming mp3s, & read Elvis ... www.myspace.com/elviscostello - Cached - Simila

Elvis Costello Guide :: Discography | Setlists | Songs | Lyrics ... Elvis Costello Guide : Complete Costello resource with discography, set lists, web sites list, pictures, photos, recordings, CDs, books, movies, videos, ... www.elvis-costello.com/ - Cached - Similar

Elvis Costello – Discover music, videos, concerts, & pictures at ... Watch videos & listen to Elvis Costello: Alison, Pumn II Un & more, plus 46 pictures, Declan

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Search



# alltheweb.com

### 1999-2003



# **Enterprise Search**

### Much more than intranets





## **Data Centers**

### alltheweb.com 2000



## **Data Centers**

### Microsoft 2010



http://www.youtube.com/watch?v=K3b5Ca6lzqE





Search options

Home Videos Channels

Microsoft Data Centers nanagement.techweb.com Highly efficient. Easy to manage. Geat visibility. Golden keys here!



Microsoft OS Cloud Windows Azure Data Center - Google and Amazon www.hostedflp.com http Microsoft has unveiled a cloud computing service, in which data and applications will not be stored on individuals ... \*\*\*\*\*\* 1 year ago 46,479 views richm711



Microsoft Generation 4.0 Data Center Vision Microsoft has published a video outlining key concepts for its Generation 4 Modular  $Data\ Center$  , which it unveiled in Dec 2008. Heres a look at ... ★★★★★ 6 months ago 3,003 views Krishna78



http://www.youtube.com/watch?v=PPnoKb9fTkA

# Search Platform Anatomy

The 50,000 Foot View



# Scaling

#### Content Volume

- How many documents are there?
- How large are the documents?
- Content Complexity
  - How many fields does each document have?
  - How complex are the field structures?

#### • Query Traffic

- How many queries per second are there?
- What is the latency per query?
- Update Frequency
  - How often does the content change?
- Indexing Latency
  - How quickly must new data become searchable?
- Query Complexity
  - How many query terms are there?
  - What is the type and structure of the query terms?





**Content Volume** 

Scale through partitioning the data

# Crawling The Web



# **Processing The Content**

HTML, PDF, Word, Excel, PowerPoint, XML, Zip, ...

Format detection

"30,000", "L'Hôpital's rule", "台湾研究", ...

Tokenization

Persons, companies, events, locations, dates, quotations,

**Entity extraction** 

UTF-8, ISCII, KOI8-R, Shift-JIS, ISO-8859-1, ...

Encoding detection

Øhrn, Ohrn, Oehrn, Öhrn, ...

Character normalization

Who said what, who works where, what happened when, ...

**Relationship extraction** 

English, Polish, Danish, Japanese, Norwegian, ...

Language detection

Go, went, gone Car, cars Silly, sillier, silliest

Lemmatization

Positive or negative, liberal or conservative, ...

Sentiment analysis

Title, headings, body, navigation, ads, footnotes, ...

Parsing

"buljongterning", "Rindfleischetikett ierungsüberwachu ngsaufgabenübert ragungsgesetz", ...

Decompounding

Sports, Health, World, Politics, Entertainment, Spam, Offensive Content, ...

Classification

# **Creating The Index**





Document

Position

Word

# **Deploying The Index**

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## **Processing The Query**





http://www.stanford.edu/class/cs276/handouts/lecture2-dictionary.pdf



Assess relevancy as we go along



"Divide and conquer"

Tiering



"All search nodes are equal, but some are more equal than others"

### **Context Drilling**



"If the result set is too large, only consider the superior contexts"

# Relevancy



### "Maximize the normalized discounted cumulative gain (NDCG)"

# **Processing The Results**

### • Faceted browsing

- What are the distributions of data across the various document fields?
- "Local" versus "global" meta data

#### • Result arbitration

- Which results from which sources should be displayed in a federation setting?
- How should the SERP layout be rendered?
- Unsupervised clustering
  - Can we automatically organize the results set by grouping similar items together?

### Last-minute security trimming

Does the user still have access to each result?

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# Data Mining

#### MapReduce: Simplified Data Processing on Large Clusters

Jeffrey Dean and Sanjay Ghemawat

jeff@google.com, sanjay@google.com

Google, Inc.

#### Abstract

MapReduce is a programming model and an associated implementation for processing and generating large data sets. Users specify a map function that processes a key/value pair to generate a set of intermediate key/value pairs, and a reduce function that merges all intermediate values associated with the same intermediate key. Many real world tasks are expressible in this model, as shown in the paper.

Programs written in this functional style are automatically parallelized and executed on a large cluster of commodity machines. The run-time system takes care of the details of partitioning the input data, scheduling the program's execution across a set of machines, handling machine failures, and managing the required inter-machine communication. This allows programmers without any experience with parallel and distributed systems to easily utilize the resources of a large distributed system.

Our implementation of MapReduce runs on a large cluster of commodity machines and is highly scalable: a typical MapReduce computation processes many terabytes of data on thousands of machines. Programmers find the system easy to use: hundreds of MapReduce programs have been implemented and upwards of one thousand MapReduce jobs are executed on Google's clusters every day.

#### 1 Introduction

Over the past five years, the authors and many others at Google have implemented hundreds of special-purpose computations that process large amounts of raw data, such as crawled documents, web request logs, etc., to compute various kinds of derived data, such as inverted indices, various representations of the graph structure of web documents, summaries of the number of pages crawled per host, the set of most frequent queries in a

#### To appear in OSDI 2004

given day, etc. Most such computations are conceptually straightforward. However, the input data is usually large and the computations have to be distributed across hundreds or thousands of machines in order to finit a reasonable amount of time. The issues of a allelize the computation, distribute the failures conspire to obscure the original tation with large amounts of com these issues.

As a reaction to this com abstraction that allows us to tions we were trying to p tails of parallelization. and load balancing in spired by the map and and many other func most of our computation

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The major contribution

powerful interface the and distribution of with an implement high performance Section 2 descri gives several exam. mentation of the Map. , tailored our cluster-based computing car nonment tion 4 de scribes several refinements of the progr ? model that we have found useful. Section 5 has performance measurements of our implementation for a variety of tasks. Section 6 explores the use of MapReduce within Google including our experiences in using it as the basis

#### SCOPE: Easy and Efficient Parallel Processing of Massive Data Sets

Ronnie Chaiken, Bob Jenkins, Per-Åke Larson, Bill Ramsey, Darren Shakib, Simon Weaver, Jingren Zhou Microsoft Corporation

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#### ABSTRACT

s providing cloud-scale services have an increasing pre and analyze massive data sets such as search logs reams. For cost and performance reasons, processing is done on large clusters of shared-nothing commodity velop a programming model that hides the ng system but provides flexonality to meet a variety

> nd extensible script tions Optimized for massive data analywith no explicit parparallel execution on es from SOL Data is columns. The select oins, and aggregation a functions and implemactors (parsing and consors (row-wise processing) ), and combiners (combining apports nesting of expressions e specified as a series of steps, rogrammers. We also describe icient, parallel execution plans

lyze massive data sets, such as d by crawlers, and click streams services. Such analysis is becom siness in a variety of ways, for uality and support novel features, to er time, and to detect fraudulent ac-

se data sets, traditional parallel database ubitively expensive. To be able to perform ale analysis in a cost-effective manner, several

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companies have developed distributed data storage and processing systems on large clusters of shared-nothing commodity servers, including Google's File System [8], Bigtable [3], Map-Reduce [5], Hadoop [1], Yahoo!'s Pig system [2], Ask.com's Neptune [4], and Microsoft's Dryad [6]. A typical cluster consists of hundreds or thousands of commodity machines connected via a high-bandwidth network. It is challenging to design a programming model that enables users to easily write programs that can efficiently and effectively utilize all resources in such a cluster and achieve maximum degree of parallelism.

The Map-Reduce programming model provides a good abstraction of group-by-aggregation operations over a cluster of machines. The programmer provides a map function that performs grouping and a reduce function that performs aggregation. The underlying run-time system achieves parallelism by partitioning the data and processing different partitions concurrently using multiple ma-. chine:

However, this model has its own set of limitations. Users are forced to map their applications to the map-reduce model in order to achieve parallelism. For some applications this mapping is very unnatural. Users have to provide implementations for the map and reduce functions, even for simple operations like projection and selection. Such custom code is error-prone and hardly reusable. Moreover, for complex applications that require multiple stages of map-reduce, there are often many valid evaluation strategies and execution orders. Having users implement (potentially multiple) map and reduce functions is equivalent to asking users specify physical execution plans directly in database systems. The user plans may be suboptimal and lead to performance degradation by orders of magnitude.

In this paper, we present a new scripting language, SCOPE (Structured Computations Optimized for Parallel Execution), targeted for large-scale data analysis that is under development at Microsoft. Many users are familiar with relational data and SOL. SCOPE intentionally builds on this knowledge but with simplifications suited for the new execution environment. Users familiar with SQL require little or no training to use SCOPE. Like SQL, data is modeled as sets of rows composed of typed columns. Every rowset has a well-defined schema. The SCOPE runtime provides implementations of many standard physical operators, saving users from implementing similar functionality repetitively SCOPE is being used daily for a variety of data analysis and data mining applications inside Microsoft.

SCOPE is a declarative language. It allows users to focus on the data transformations required to solve the problem at hand and hides the complexity of the underlying platform and implementation details. The SCOPE compiler and optimizer are responsible for generating an efficient execution plan and the runtime for executing the plan with minimal overhead



# Applications

## Spellchecking

488941 britney spears 40134 brittany spears 36315 brittney spears 24342 britany spears 7331 britny spears 6633 briteny spears 2696 brittenv spears 1807 briney spears 1635 brittny spears 1479 brintey spears 1479 britanny spears 1338 britiny spears 1211 britnet spears 1096 britiney spears 991 britaney spears 991 britnay spears 811 brithney spears 811 brtiney spears 664 birtney spears 664 brintney spears 664 briteney spears 601 bitney spears 601 brinty spears 544 brittaney spears 544 brittnay spears 364 britey spears 364 brittiny spears 329 brtney spears 269 bretney spears 269 britneys spears 244 britne spears 244 brytney spears 220 breatney spears 220 britiany spears 199 britnney spears 163 britnry spears 147 breatny spears 147 brittiney spears 147 britty spears 147 brotney spears 147 brutney spears 133 brittenev spears 133 briyney spears 121 bittany spears 121 bridney spears 121 britainy spears 121 britmey spears 109 brietnev spears 109 brithny spears 109 britni spears 109 brittant spears 98 bittney spears 98 brithey spears 98 brittiany spears 98 btitney spears 89 brietny spears 89 brinety spears 89 brintny spears 89 britnie spears 89 brittey spears

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9 brinttany spears 9 britanay spears 9 britinany spears 9 brith spears 9 britnew spears 9 britnevn spears 9 britrney spears 9 brtiny spears 9 brtittnev spears 9 brtny spears 9 brytny spears 9 rbitney spears 8 birtiny spears 8 bithney spears 8 brattany spears 8 breitny spears 8 breteny spears 8 brightny spears 8 brintay spears 8 brinttev spears 8 briotney spears 8 britanys spears 8 britley spears 8 britneyb spears 8 brithrey spears 8 brithty spears 8 brittner spears 8 brottany spears 7 baritney spears 7 birntey spears 7 biteney spears 7 bitiny spears 7 breateny spears 7 brianty spears 7 brintye spears 7 britianny spears 7 britly spears 7 britnej spears 7 britnevu spears 7 britniev spears 7 britnnav spears 7 brittian spears 7 brivny spears 7 brrittany spears 7 brttiney spears 7 btiteny spears 7 btrittany spears 6 beritny spears 6 bhritney spears 6 birthney spears 6 breathney spears 6 breaty spears 6 bretany spears 6 briatany spears 6 brint spears 6 britenney spears 6 britian spears 6 britinty spears 6 brititney spears 6 britnsy spears

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http://www.google.com/jobs/britney.htm

# Spellchecking







2. Find the best path in the lattice using the Viterbi algorithm. Use, e.g., candidate scores and bigram statistics to guide the search.

# **Entity Extraction**



- 1. Logically annotate the text with zero or more computed layers of meta data. The original surface form of the text can be viewed as trivial meta data.
- 2. Apply a pattern matcher or grammar over selected layers. Use, e.g., handcrafted rules or machine-trained models. Extract the surface forms that correspond to the matching patterns.



base=bad

morph=0:b POS=ADJ

weight=100

sem=

base=bad

morph=0:b

weight=0

POS=ADV

sem=

base=curry

morph=0:e

weight=100

P0S=N

# **Sentiment Analysis**



- 1. To construct a sentiment vocabulary, start by defining a small seed set of known polar opposites.
- 2. Expand the vocabulary by, e.g., looking at the context around the seeds in a training corpus.
- 3. Use the expanded vocabulary to build a classifier. Apply special heuristics to take care of, e.g., negations and irony.

"What are the most emotionally charged issues in American politics right now?"

## **Contextual Search**



xml:paragraph:quotation:(@speaker:"greenspan" and scope(price))

Persons that appear in documents that contain the word {soccer}



#### person@base

Jack Nicklaus (~10.0%) Fred Davis (~10.0%) Billie Jean King (~8.0%) Richard Nixon (~8.0%) John Wayne (~7.0%) Margaret Smith (~7.0%) Joe Frazier (~7.0%) Irina Rodnina (~7.0%) Mao Zedong (~8.0%) Gordie Howe (~8.0%) Richard M. Nixon (~8.0%)

Example from Wikipedia

More.

#### person@base

Diego Maradona (~4.0%) David Beckham (~4.0%) Alan Shearer (~3.0%) Michelle Akers (~3.0%) Mia Hamm (~3.0%) Eric Wynalda (~3.0%) Freddy Adu (~3.0%) Michel Platini (~2.0%) Stanley Matthews (~2.0%) Oliver Neuville (~2.0%) Bobby Moore (~2.0%) Persons that appear in **paragraphs** that contain the word *{soccer}* 



More.

# **Contextual Search**

1. During content processing, identify structural and semantic regions of interest. Mark them up in context, possibly decorated with meta data.

D-Day is the name given to the landing of 160,000 Allied troops in Normandy, France, on June 6, 1944. The success of the invasion of Normandy was really the beginning of the end for Nazi Germany. The invasion, also called.. <sentence>D-Day is the name given to the landing of 160,000 Allied troops in <location
country="france">Normandy</location>, <location type="country">France</location>, on <date
base="1944-06-06">June 6, 1944</date>.</sentence><sentence>The success of the invasion of
<location country="France">Normandy</location> was really the beginning of the end for Nazi
Germany.</sentence><sentence>The invasion, also called..

2. Make all the marked-up data fully searchable in a way that preserves context and where retrieval can be constrained on both structure and content. Possibly translate natural language queries into suitable system queries.



# Machine Translation

Web Images News More   MSN   Hotmail				Sign in   Norway	Preferences				
Beta Translator									
Home   Tools   Help		Free	online translation service	e for a truly <i>worldwid</i> e we	b				
Languages English 💌	👈 Danish	•	Translate Clear	r All Add to Favorite	<u>s</u>				
Enter text or webpage URL				Report offensive translation	ns				
The University of Oslo is Norway's largest and oldest i higher education. It was founded in 1811 when Norway Danish rule. Today the University of Oslo has approx. and 5 900 employees. Four Nobel Prize winners indica of the research at the University.	institution of y was still under 27 700 students ates the quality	Universitetet i Oslo er videregående uddanne stadig under dansk re studerende og 5 900 r kvaliteten af forskning	Norges største og ælds Iser. Det blev grundlagt gel. Universitetet i Oslo I nedarbejdere. Fire Nobe en på universitetet.	te institution af de i 1811 hvor Norge var har i dag ca. 27 700 Iprisen vindere angiver					
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Translated Search			Enter text or a webpage URL, or upload a document.						
New: To help with Haitian relief efforts we have built a beta Haitia engine. Simply select it in the Language drop-down box above.	an Creole trar Translato Tools and Resource	or Toolkit Was fi Oslo es	The University of Oslo is Norway's largest and oldest institution of higher education. It was founded in 1811 when Norway was still under Danish rule. Today the University of Oslo has approx. 27 700 students and 5 900 employees. Four Nobel Prize winners indicates the quality of the research at the University.						
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# **Query Completion**



# **Caption Generation**

Web Images Videos Maps News Shopping Gmail more v

#### Intra-document search

- Locate and rank relevant document fragments
- But do it fast!

#### Perceived relevancy

- First impressions count
- Can make or break a service

#### • Trends towards richer captions

- Format-specific interactivity
- Actionable elements



