

# Digital Libraries

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Orientation

Week 1

Min-Yen KAN



# What is a library?

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1. A place set apart to contain books for reading, study, or reference.
  - (**Not applied**, e.g. to the shop or warehouse of a **bookseller**.)
2. A **building** ... containing a collection of books for the use of the public or of some particular portion of it, or of the members of some society or the like;
3. a public institution or establishment, charged with the **care** of a collection of books, and the duty of **rendering the books accessible** to those who require to use them.



# What is a library?

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1. A private commercial establishment for the lending of books, the borrower **paying** either a fixed sum for each book lent or a periodical **subscription**.
2. a great mass of **learning or knowledge**;
3. the objects of a person's study, the sources on which he depends for instruction.
4. *Computers*. An organized collection of routines, esp. of tested routines suitable for a particular model of computer
5. *Biology*. a collection of sequences of DNA ... that represent the genetic material of a particular organism or tissue

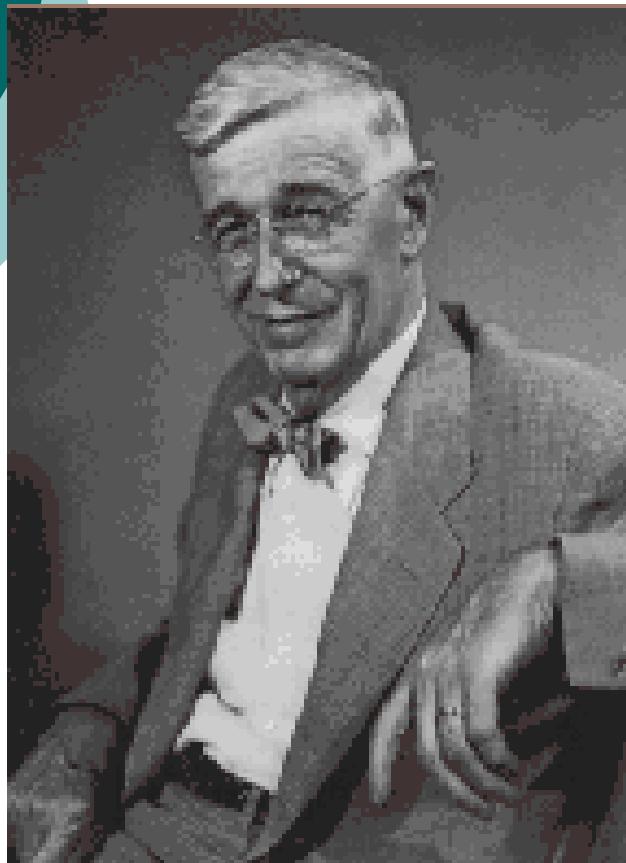


# Introduction

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- Bush's "As we may think"
  - Writes this at the end of WW II
  - \_\_\_\_\_ was the first computer, born to compute ballistic tables fast
  - \_\_\_\_\_ just invented 5 years ago
  - \_\_\_\_\_ ("display technology") still a less than perfect process.
  - \_\_\_\_\_ ("storage technology") was a mature and stable technology.

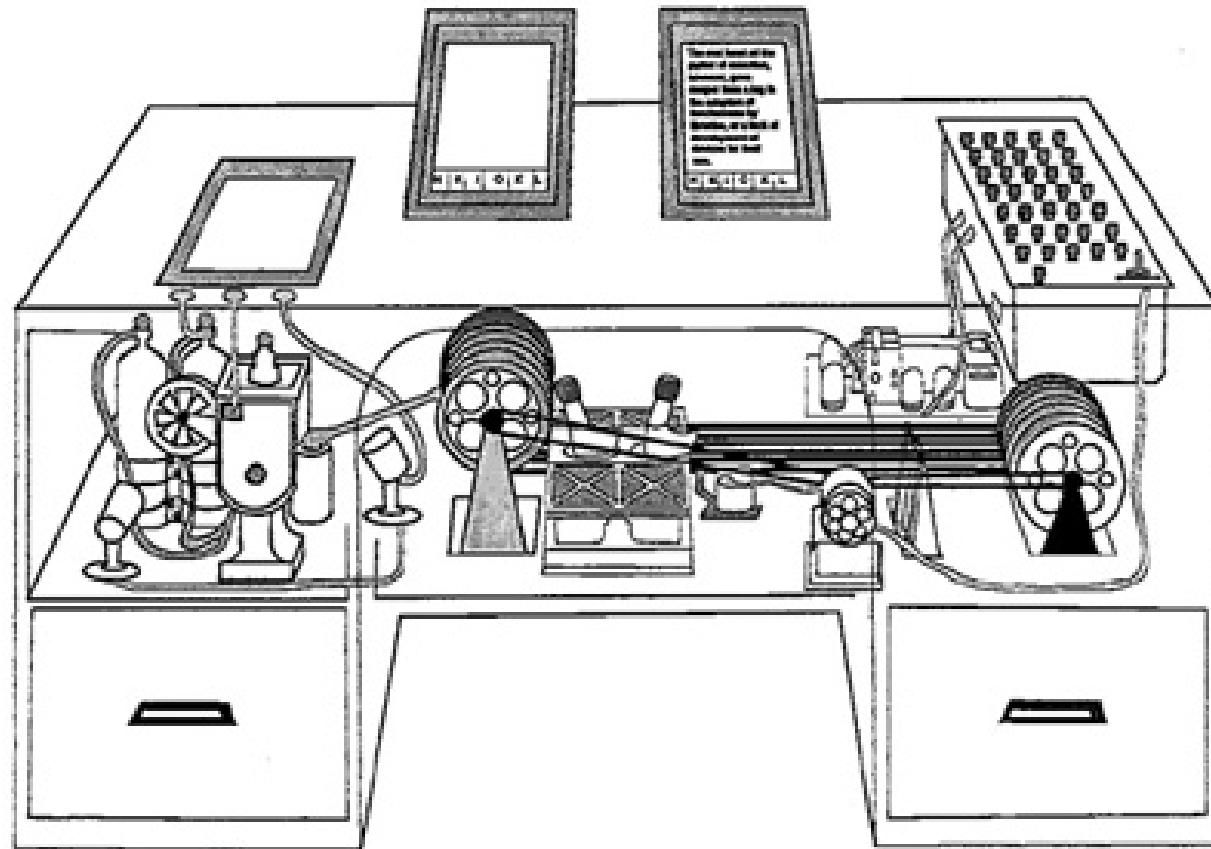
# Vannevar Bush (1890-1974)



- Director of the Office of Scientific Research and Development
  - lead 6000 scientists in R&D for WWII
- Predicted many technological advances
  - the “memex” is one whose spirit we are implementing
  - the purpose was to provide scientists the capability to exchange information; to have access to the totality of recorded information

# Design for Memex (c. 1945)

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# Memex

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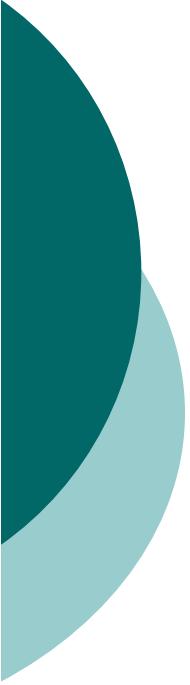
- Integrated computer, keyboard, and desk
- “mechanized private file and library”
  - remove drudgery from information retrieval
  - suggested implementation was microfilm
  - various user operations are suggested
- \_\_\_\_\_ was the main purpose
  - “the process of tying two items together is the important thing”
  - prelude to hypertext...



# Memex

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- Information could come pre-associatively indexed, but the key point was \_\_\_\_\_
  - WWW still does not provide that today
- Bush observes that tools change our way of doing, and expand the horizons before us
  - full impact of WWW and DLs still not known



# What is a Digital Library (DL)?

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- “a collection of information that is both digitized and organized” (Lesk)
  - there are numbers of alternate definitions, but this seems fair enough
  - no mention of \_\_\_\_\_, \_\_\_\_\_, \_\_\_\_\_, etc.
- It is not just to reform the current library system, rather, we aim to
  - organize and access the “information overload”



# Outline for today

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- Introduction to libraries ✓
- Course administration
- Reading and writing research
- To think about



# Course administration

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- Teaching staff
- Web sites
- Objective
- Syllabus
- Assessment overview
- Survey paper and project

Any questions?



# Teaching staff

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- Lecturer:  
Min-Yen Kan ("Min")  
[kanmy@comp.nus.  
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Office: S15 05-05  
6875-1885  
Hours: 4-6 pm  
Tuesdays  
Interests:  
rock climbing,  
ballroom dancing,  
and inline skating...  
and **digital libraries!**



# Course web sites

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<http://ivle.nus.edu.sg/>

- Discussion forum
  - Any questions related to the course should be raised on this forum
  - I expect you to talk amongst yourselves to answer questions, so will not answer questions here much.
  - Send me emails for urgent or personal matters
- Announcements!
- Workbin: Lecture notes (purposely incomplete!)

<http://www.comp.nus.edu.sg/~cs5244>

- Grading specification
- Other supplementary content



# Objective

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- Building, using, presenting and maintaining large volumes of information
- Contrast computational approaches with traditional library science methods



# Hey min, go over the website!

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- <http://www.comp.nus.edu.sg/~cs5244>



# Discussions

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Class participation is very important. There are no “dumb” questions. You will only be penalized for “no” questions / comments.

Possibilities:

- Name tags
- Cold calls
- Small group discussion and presentation



## Midterm and Final

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- 1 hour midterm (10%) and a 2 hour final (20%)
  - Both basically of the same format
  - Calculation questions – that have an exact answer
  - Essay questions – many to look at tradeoffs in the digital library realm
    - No necessarily right or wrong answers



# Literature survey

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- Each student will pick an area of study to survey at least **4** papers in detail.
- Must be **interesting** to you
- Journal or conference papers from an authority list
- Limit to 6 pages
- Individual work only
- Give your perspective on area's future
- Add value by comparing strengths and weaknesses of different approaches.



# Final project

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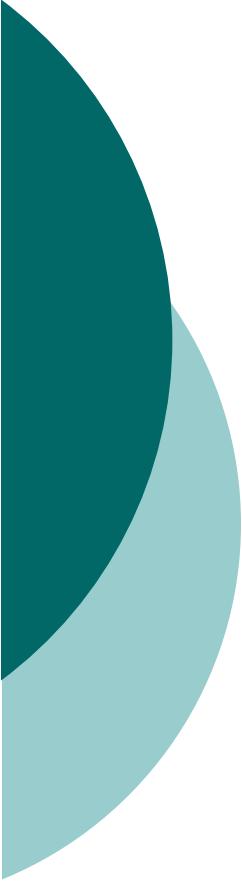
- Students will self-organize into groups for the final projects, shortly after the survey papers are due.
  
- Requires **original** work
- Cooperation and coordination
- Report as a conference submission
- Poster presentation to the public
- Sample topics on the web page



# Outline for today

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- Introduction to libraries ✓
- Course administration ✓
- Reading and writing research
- To think about



## Efficient Reading of Papers in Science and Technology

This brochure provides an approach to help you read scientific papers efficiently and effectively.

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Prepared by:  
Michael J. Hanson  
Updated by:  
Dylan J. McNamee

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# Reading and writing research papers

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## References:

- [http://www.cse.ogi.edu/~dylan/  
efficientReading.html](http://www.cse.ogi.edu/~dylan/efficientReading.html)
- <ftp://fast.cs.utah.edu/pub/writing-papers.ps>

This section partially from Surendar Chandra  
of University of Notre Dame.



# Why do you read a paper?

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- Understand and learn new contributions
- However...
  - Not all papers are “good”
  - Not all papers are “interesting”
  - Not all papers are “worthwhile” for you
- You have to learn to identify a good paper and spend your time wisely
  - 1. Breadth
  - 2. Depth
  - 3. React



# Reading a research paper

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- What is this paper about?
  1. Read the title and the abstract  
If you still don't know what this paper is about,  
then this is a poorly-written paper.
  2. Read the conclusion  
Are you now sure you know what this paper is  
about? If not, throw it away.
  3. Read the \_\_\_\_\_
  4. Read the \_\_\_\_\_
  5. Read \_\_\_\_\_ and captions



# How to read a paper

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- See who wrote it, where it was published, when was it written (credibility)
- Skim references
  - Are authors are aware of relevant related work?
  - Do you know the work that they cite?
  - Do you know other work that they should have cited?



# How to read a paper - depth

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- Approach with scientific skepticism
- Read with context of other things that you've read in mind
  - It's only one part of the puzzle of a subject
- Examine the **assumptions**. Are they:
  - Reasonable?
  - What are the limitations of the work
    - There are always limitations! Did they disclose them?



# How to read a paper - depth

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- Examine the **methods**:
  - Did they measure what they claim?
  - Can they explain what they observed?
    - Want an analysis of **why** the system behaves a certain way, not raw data.
  - Did they have adequate controls?
  - Were tests carried out in a standard way?  
Were the performance metrics standard?
    - If not, do they explain their metrics clearly?



# How to read a paper - depth

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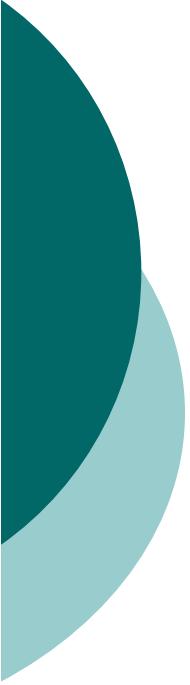
- Examine the **statistics**:  
“Lies, d\*mned lies and statistics”
  - Appropriate statistical tests applied properly?
  - Did they do proper error analysis?
  - Are the results statistically significant?



# How to read a paper - depth

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- Examine the conclusions:
  - Do the conclusions follow logically from the experiments?
  - What other explanations are there for the observed effects ?
  - What other conclusions or correlations are in the data that were not pointed out?



# How to read a paper - react

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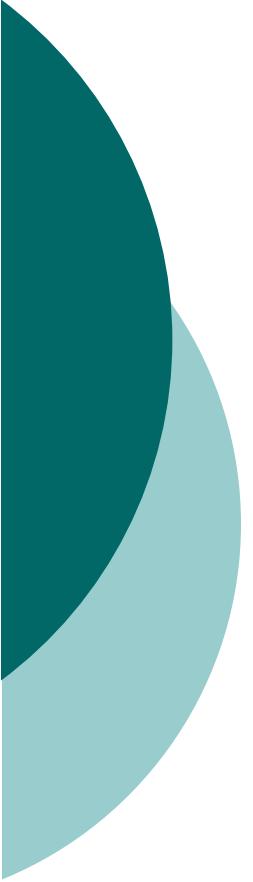
- Take notes
- Highlight major points
- React to the points in the paper
  - Place this work with your own experience
  - If you doubt a statement, note your objection
- **Summarize** what you read
  - Good practice: maintain your own bibliography of all papers that you ever read
  - \_\_\_\_\_ !



# How to write a research paper

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- Write it such that anyone who reads it using the method we just discussed understands the idea
- Clearly explain what problem you are solving, why it is interesting and how your solution solves this interesting problem
- Be crisp. Explain what your contributions are, what your ideas are and what are others' ideas



# Any questions?

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Introduction to libraries ✓

Course administration ✓

Reading and writing research ✓



## To think about for discussion

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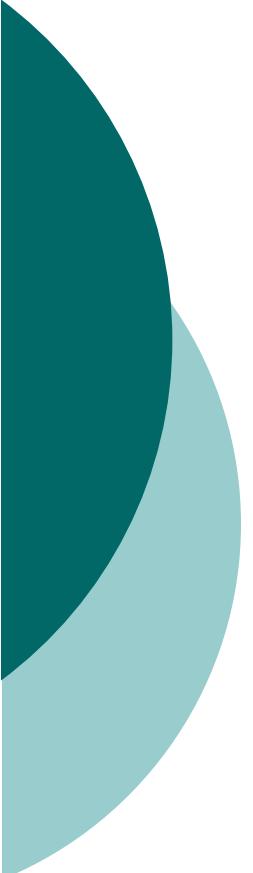
- What are the functions of a traditional library?
- Are these same functions in the **digital** library?
- How is the digital library different from:
  - \_\_\_\_\_?
  - \_\_\_\_\_?

# Coffee Break

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See ya!



# Digital Libraries

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Week 1

Min-Yen KAN

Implementation of  
(Textual) Information Retrieval



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# What is information retrieval?

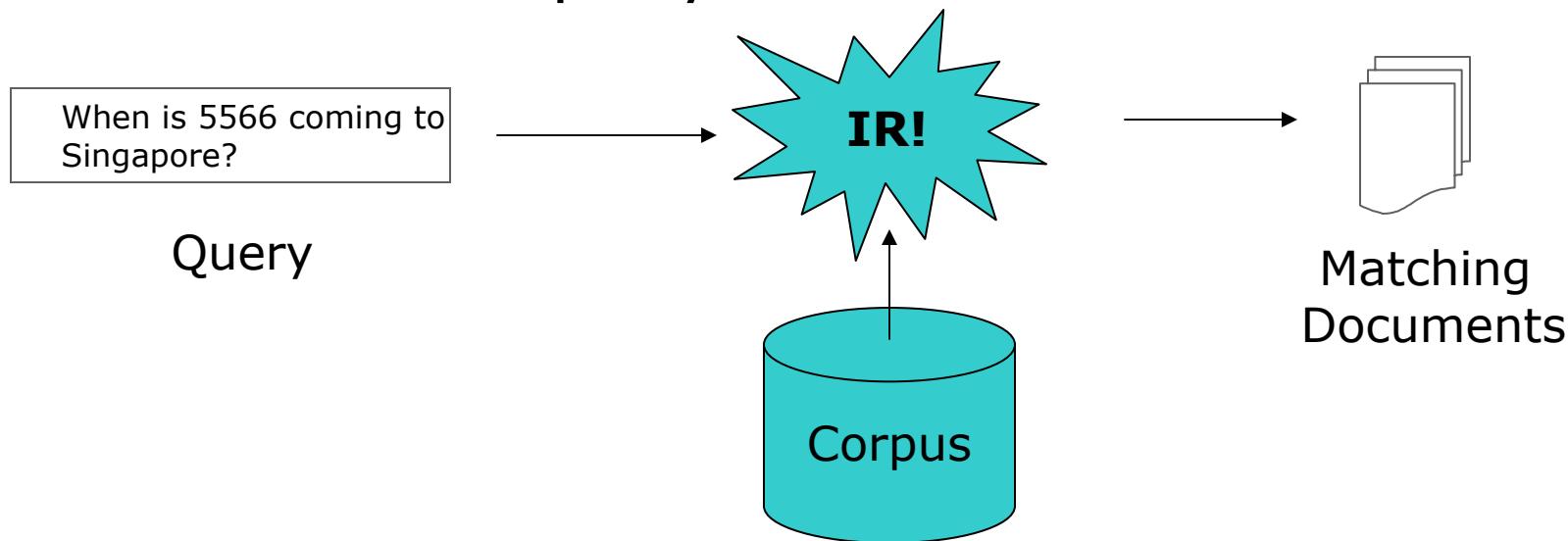
Midterm questions for Digital Libraries

Search

Search

# What is information retrieval?

- Part of the information seeking process
- Matches a query with most relevant documents
- View a query as a \_\_\_\_\_ -





# Searching in books

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- \_\_\_\_\_
- \_\_\_\_\_
- \_\_\_\_\_
- Procedure:
  - Look up topic
  - Find the page
  - Skim page to find topic

...  
Index, 11, 103-151, 443  
Audio, 476  
Comparison of methods 143-145  
Granularity, 105, 112  
N-gram, 170-172  
Of integer sequences, 11  
Of musical themes, 11  
Of this book, 103, 507ff  
Within inverted file entry, *see skipping*  
Index compression, 114-129, 198-201, 235-237  
Batched, 125, 128  
Bernoulli, 119-122, 128, 150, 247, 421  
Context-sensitive, 125-126  
Global, 115-121  
Hyperbolic model, 123-124, 150  
In MG, 421-423  
Interpolative coding, 126-128  
Local, 115, 121-122, 247  
Nonparameterized, 115-119  
Observed frequency, 121, 124-125, 128, 247  
Parameterized, 115  
Performance of, 128-129, 421  
Skewed Bernoulli, 122-123, 138, 150  
Within-document frequencies, 198-201  
Index Construction, 223-261 (*see also* inversion)  
bitmaps, 255-256  
...



# Information retrieval

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- Algorithm
  - (Permute query to fit index)
  - Search index
  - Go to resource
  - (Permute query to fit item)
  - (Search for item)



# What to index?

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- Books indices have key words and phrases
- Search engines index \_\_\_\_\_

Why the disparity?

What do people really search for?

What is a **word**?

- Maximal sequence of alphanumeric characters
- Limited to at most 256 characters and at most 4 numeric characters.

- MG indexing system



# Trading precision for size

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Can save up to **32%** without too much loss:

- Stemming
  - Usually just word inflection
  - Information → Inform = Informal, Informed
- Case folding
  - **N.B.**: keep odd variants (e.g., NeXT, LaTeX)
- Stop words
  - Don't index common words, people won't search on them anyways

**Pop Quiz:** Which of these techniques are more effective?

# Indexing output

- Output =  $L_w, D_D, I_{W \times D}$
- Inverted File (Index)
  - Postings (e.g.,  $w_t \rightarrow (d_1, f_{w_t, d_1}), (d_2, f_{w_t, d_2}), \dots, (d_n, f_{w_t, d_n})$ )
  - Variable length records
- Lexicon:
  - String  $W_t$
  - Document frequency  $f_t$
  - Address within inverted file  $I_t$
  - Sorted, fixed length records

$x$	$W_f$	$D_1$	$D_2$	$D_3$	$D_4$	$D_5$	$D_6$	$\dots$	$D_m$
	$W_1$	2		1		1			
	$W_2$	3	2			1			
	$W_3$	1		1					
	$W_4$	2			1		1		
	$W_5$	2		1		1			
	$W_6$	3			1	1	1		
	$\dots$								
	$W_n$								
	Lexicon								

Inverted File  
(Postings File)

To think about: What type of entries are missing from the search engine index that are present in the book index?



# Trading precision for size, redux

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Pop Quiz: Which of these techniques are more effective?

Typical:

Lexicon = 30 MB

Inverted File: 400 MB

- Stemming
  - Affects Lexicon
- Case folding
  - Affects Lexicon
- Stop words
  - Affects Inverted File

# Is fine-grained indexing worthwhile?

- **Problem:** still have to scan document to find the term.

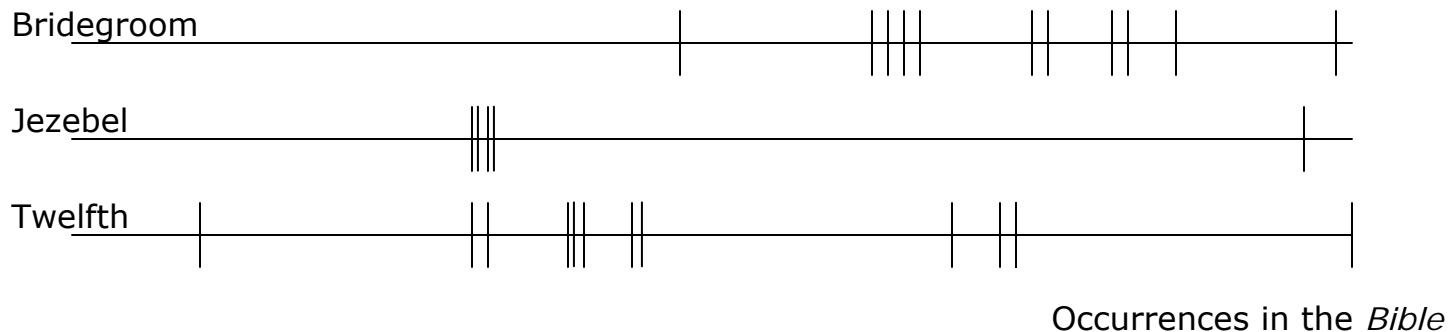
Image	(D1, 2), (D4, 1)
Implicit	(D2, 1), (D3, 1) ...
Index	(D5, 3), (D2, 1) ...
Inverse	(D2, 2)
Internet	(D1, 2), (D3, 2) ...



Image	(D1, 2; 10, 205), (D4, 1, 3993)
Implicit	(D2, 1; 242), (D3, 1; 233) ...
Index	(D5, 3; 20, 42, 3920), (D2, 1 ...
Inverse	(D2, 2; 599, 847)
Internet	(D1, 2; 12, 43), (D3, 2; 302, ...

- Cons:
  - Need access methods to take advantage
  - Extra storage space overhead (variable sized)
- Alternative methods:
  - Hierarchical encoding (doc #, para #, sent #, word #) to shrink offset size
  - Split long documents into  $n$  shorter ones.

# Inverted file compression



- Clue: Encode *gap length* instead of offset
- Use small number of bits to encode more common gap lengths
  - (e.g., Huffman encoding)
- Better: Use a distribution of expected gap length (e.g., Bernoulli process)
  - If  $p$  = prob that any word  $x$  appears in doc  $y$ , then
  - Then  $p_{\text{gap size } z} = (1-p)^z p$ . This constructs a geometric distribution.
- Works for intra and inter-document index compression
  - Why does it hold for documents as well as words?

# Building the index – Memory based inversion

Initialize empty dictionary S

## // Phase I – collection of term appearances in memory

For each document  $D_d$  in collection,  $1 \leq d \leq N$

    Read  $D_d$ , parsing it into index terms

    For each index term  $t$  in  $D_d$

        Calculate  $f_{d,t}$

        Search in S for  $t$ , if not present, insert it

        Append node  $(d, f_{d,t})$  to list for term  $t$

## // Phase II – dump inverted file

For each term  $1 \leq t \leq n$

    Start a new inverted file entry

    Append each appropriate  $(d, f_{d,t})$  in list to entry

    Append to inverted file

- Takes lots of main memory, ugh!
- Can we reduce the memory requirement?

# Sort-based inversion

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- **Idea:** try to make random access of disk (memory) sequential

**// Phase I – collection of term appearances on disk**

For each document  $D_d$  in collection,  $1 \leq d \leq N$

    Read  $D_d$ , parsing it into index terms

    For each index term  $t$  in  $D_d$

        Calculate  $f_{d,t}$

**Dump to file a tuple  $(t,d,f_{d,t})$**

**// Phase II – sort tuples**

**Sort all the tuples  $(t,d,f)$  using External Mergesort**

**// Phase III – write output file**

Read the tuples in sorted order and create inverted file

# Sort based inversion: example

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<a,1,2>
<b,1,2>
<c,1,1>
<a,2,2>
<d,2,1>
<b,2,1>
<b,3,1>
<d,3,1>

Initial dump  
from corpus

<a,1,1>
<a,2,2>
<b,1,2>
<c,1,1>
<b,2,1>
<b,3,1>
<d,2,1>
<d,3,1>

Sorted Runs

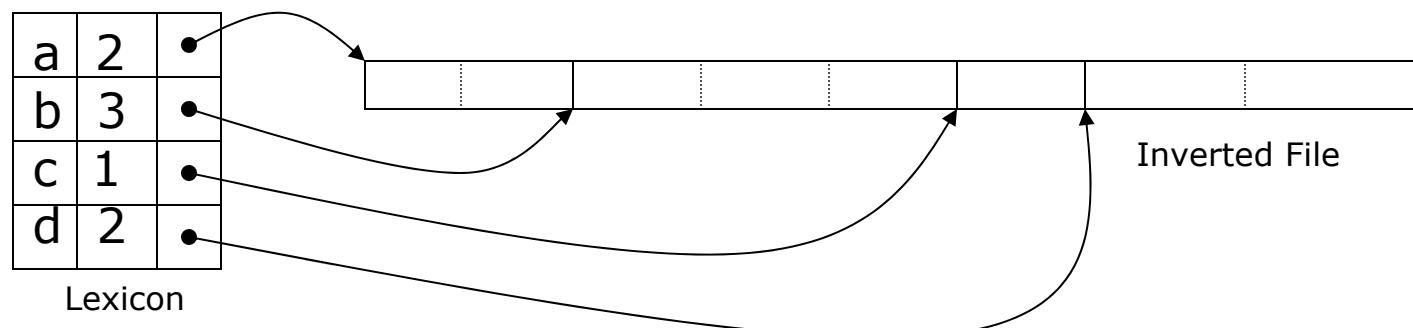
<a,1,1>
<a,2,2>
<b,1,2>
<b,2,1>
<b,3,1>
<c,1,1>
<d,2,1>
<d,3,1>

Merged Runs  
(fully sorted)

- What's the performance of this algorithm?
- Saves memory but very disk intensive!

# Using a first pass for the lexicon

- Gets us  $f_{d,t}$  and N
  - **Savings:** For any  $t$ , we know  $f_{d,t}$ , so can use an array vs. LL (shrinks record by 40%)





# Lexicon-based inversion

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- Partition inversion as  $|I|/|M| = k$  smaller problems
  - build  $1/k$  of inverted index on each pass
  - (e.g., a-b, b-c, ..., y-z)
  - Tuned to fit amount of main memory in machine
  - Just remember *boundary words*
- Can pair with disk strategy
  - Create  $k$  temporary files and write tuples  $(t, d, f_{d,t})$  for each partition on first pass
  - Each second pass builds index from temporary file



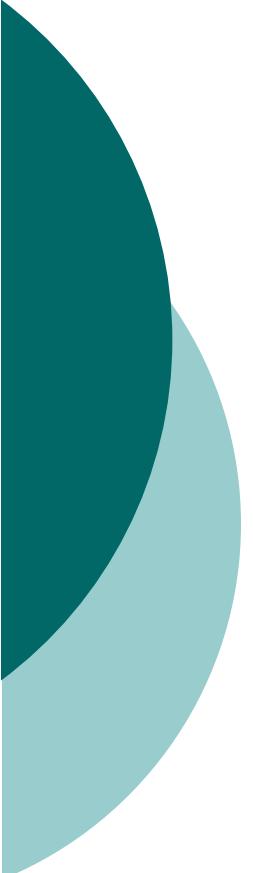
## Inversion – Summary of Techniques

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- How do these techniques stack up?
- Assume a 5 GB corpus and 40 MB main memory machine

Technique	Memory (MB)	Disk (GB)	Time (Hours)
*Linked lists (memory)	4000	0	6
Linked lists (disk)	30	4	1100
Sort-based	40	8	20
Lexicon-based	40	0	79
Lexicon w/ disk	40	4	12

Source – Managing Gigabytes



# Query Matching

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Now that we have an index, how do we answer queries?

# Query Matching

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Assuming a simple word matching engine:

```
For each query term t
  Stem t
  Search lexicon
  Record  $f_t$  and its inverted entry address,  $I_t$ 
Select a query term t
Set list of candidates,  $C = I_t$ 
For each remaining term t
  Read its  $I_t$ 
  For each d in C, if d not in  $I_t$  set  $C = C - \{d\}$ 
```

Conjunctive (AND)  
processing

- X and Y and Z – high \_\_\_\_\_
- X or Y or Z – high \_\_\_\_\_
- Which algorithm is the above?



# Boolean Model

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- Query processing strategy:
  - Join less frequent terms first
  - Even in ORs, as merging takes longer than lookup
- Problems with Boolean model:
  - Retrieves too many or too few documents
  - Longer documents are tend to match more often because they have a larger vocabulary
  - Need ranked retrieval to help out



# Deciding ranking

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- Boolean assigns same importance to all terms in a query

5566 concert dates in Singapore

Search

- “5566” has same weight as “date”

- One way:

- Assign weights to the words, make more important words worth more
- Process results in  $q$  and  $d$  vectors: (word, weight), (word, weight) ... (word, weight)



# Term Frequency

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XXXXXXXXXXXX IBM XXXXXXXXXXXX  
XXXXXXXXX XXXXXXXXXXXX IBM XXXXXXXX  
XXXXXXXXXX XXXXXXXXX Apple. XXXXXXXXXXXX  
XXXXXXXXXX IBM XXXXXXXXX. XXXXXXXXXXXX  
XXXXXXXXX Compaq. XXXXXXXXXXXX XXXXXXXX  
IBM.

(Relative) term frequency can indicate importance.

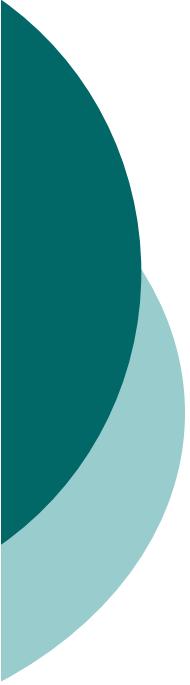
- $R_{d,f} = f_{d,t}$
- $R_{d,t} = 1 + \ln f_{d,t}$
- $R_{d,t} = (K + (1-K) \frac{f_{d,t}}{\max_i(f_{d,i})})$



# Inverse Document Frequency

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Consider a future device for individual use, which is a sort of mechanized private file and library. It needs a name, and, to coin one at random, "memex" will do.



# Inverse Document Frequency

---

Consider a future **device** for **individual** use, which is a sort of **mechanized private** file and **library**. It needs a name, and, to coin one at **random**, "**memex**" will do.

- Words with higher  $f_t$  are less discriminative.
- Use inverse to measure importance:
  - $w_t = 1/f_t$
  - $w_t = \ln(1 + N/f_t)$  ← this one is most common
  - $w_t = \ln(1 + f^m/f_t)$ , where  $f^m$  is the max observed frequency

Question: What's the  $\ln()$  here for?



# This is TF\*IDF

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- Many variants, but all capture:

- Term frequency:  
 $R_{d,t}$  as being \_\_\_\_\_
  - Inverse Document Frequency:  
 $w_t$  as being \_\_\_\_\_

- Standard formulation is:

$$w_{d,t} = \frac{r_{d,t}}{(1 + \ln(f_{d,t}))} \times \frac{w_t}{\ln(1 + N/f_t)}$$

- Problem:

- $r_{d,t}$  grows as document grows, need to normalize; otherwise biased towards \_\_\_\_\_



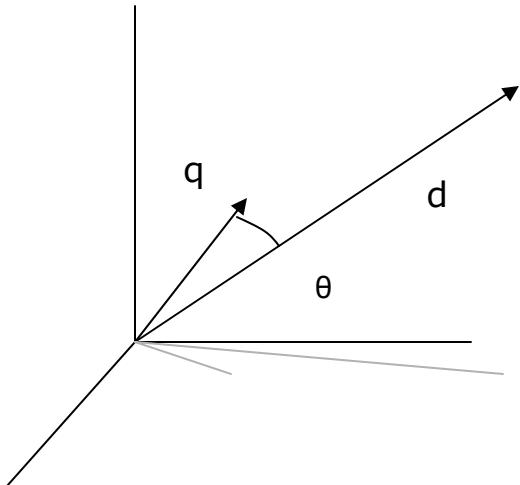
## Calculating Similarity

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- Euclidean Distance - bad
  - $M(Q, D_d) = \sqrt{(\sum |w_{q,t} - w_{d,t}|^2)}$
  - Dissimilarity Measure; use reciprocal
  - Has problem with long documents,  
**why?**
- Actually don't care about vector length, just their direction
  - Want to measure difference in direction

# Cosine Similarity

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- If  $X$  and  $Y$  are two  $n$ -dimensional vectors:

$$X \cdot Y = |X| |Y| \cos \theta$$

$$\cos \theta = X \cdot Y / |X| |Y|$$

= 1 when identical

= 0 when orthogonal

$$\begin{aligned} \text{Cos}(Q, D_d) &= Q \cdot D_d / |Q| |D_d| \\ &= (1/W_q W_d) \sum w_{q,t} \cdot w_{d,t} \\ &= (1/W_d) \sum w_{q,t} \cdot w_{d,t} \end{aligned}$$

# Calculating the ranked list

---

$$\frac{1}{W_d W_q} \sum_{t \in Q \cap D_d} (1 + \ln f_{d,t}) \bullet \ln(1 + \frac{N}{f_t})$$

- To get the ranked list, we use doc. accumulators:

For each query term  $t$ , in order of increasing  $f_t$ ,

Read its inverted file entry  $I_t$

Update acc. for each doc in  $I_t$ :  $A_d += \ln(1 + f_{d,t}) \times w_t$

For each  $A_d$  in  $A$

$A_d /= W_d$  // **that's basically cos θ, don't use  $w_q$**

Report top  $r$  of  $A$



# Accumulator Storage

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- Holding all possible accumulators is expensive
  - Could need one for each document if query is broad
- In practice, use fixed  $|A|$  wrt main memory. What to do when all used?
  - Quit: \_\_\_\_\_
  - Continue \_\_\_\_\_



## Selecting r entries from accumulators

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- Want to return documents with largest cos values.
- How? Use a min-heap

Load  $r$   $A$  values into the heap  $H$

Process remaining  $A-r$  values

If  $A_d > \min\{H\}$  then

Delete  $\min\{H\}$ , add  $A_d$ , and sift

**//  $H$  now contains the top  $r$  exact cosine values**



## To think about

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- How do you deal with a dynamic collection?
- How do you support phrasal searching?
- What about wildcard searching?
  - What types of wildcard searching are common?