Text Indexing

Lecture 10: Inverted Index

Tim Niklas Uhl

The Inverted Index

Definition: Inverted Index

Given a set of documents and terms that are contained in the documents, an inverted index stores the terms and associated with each term t

- the number of documents f_t that contain t and
- an ordered list $L(t)$ of documents containing t

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1 The old night keeper keeps the keep in the town
2 In the big old house in the big old gown
3 The house in the town had the big old keep
4 Where the old night keeper never did sleep
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term t	f_t	$L(t)$
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big	2	$[2, 3]$
dark	1	$[6]$
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had	1	$[3]$
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in	5	$[1, 2, 3, 5, 6]$
...	...	...

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The Inverted Index: Queries

Conjunctive Queries

- Given two lists M and N, return all documents contained in both lists: $M \cap N$

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Disjunctive Queries

- Given two lists M and N, return all documents contained in either list: $M \cup N$

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Disjunctive Queries

- Given two lists M and N, return all documents contained in either list: $M \cup N$

Phrase Queries

- Given two terms t_1 and t_2, return all documents containing $t_1 t_2$ ℹ all previous discussed indices can do so

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Inverted Index: Representing the Terms (1/2)

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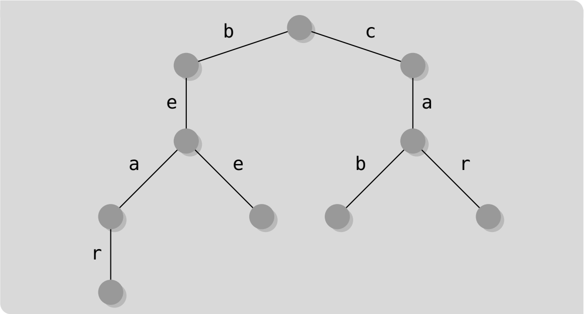
- terms can be represented using tries
- in each leaf, store pointer to list for term

- simple representation
- easy to add and remove terms



Inverted Index: Representing the Terms (2/2)

- use multiplicative hash function
- $h(t[1] \dots t[\ell]) = ((\sum_{i=1}^{\ell} a_i \cdot t[i]) \bmod p) \bmod m$
- for prime $p < m$ and
- fixed random integers $a_i \in [1, p]$

- good worst cast guarantee
- $\mathrm{Prob}[h(x) = h(y)] = O(1/m)$ for $x \neq y$

Inverted Index: Document Lists

- document ids are sorted
- if ids are in $[1, U]$, storing them requires $\lceil \lg U \rceil$ bits per id

Binary Codes

- an integer x can be represented as binary $(x)_2$
- for fast access, all binary representations must have the same width

Now

- different ideas on how to better store ids
- not all ideas work with all algorithms
- different space usage and complexity

Difference Encoding

- given a document list $N = [d_1, \dots, d_{|N|}]$
- the document ids are sorted: $d_1 < \cdots < d_{|N|}$
- store first id
- represent other ids by difference: $\delta_i = d_i - d_{i-1}$

Definition: Δ-Encoding

A **Δ-encoded** document list $N = [d_1, \dots, d_{|N|}]$ is
$N = [d_1, d_2 - d_1, \dots, d_{|N|} - d_{|N-1|}]$

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Just ids:

- $N = [4, 11, 12, 30, 42, 54]$

Δ-encoded

- $N = [4, 7, 1, 18, 12, 12]$

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- can this be compressed further?
- accessing id requires scanning

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Unary Encoding

Definition: Unary Codes

Given an integer $x > 0$, its unary code $(x)_1$ is $1^{x-1}0$

- $|(x)_1| = x$ bits
- encoded integers can be accessed using rank and select queries
- if 0 has to be encoded, all codes require an additional bit

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Unary Codes:

- $N = [111011111100 1^{17}0 1^{11}0 11111111110]$

Ternary Encoding

Definition: Ternary Codes

Given an integer $x > 0$, represent $x - 1$ in ternary using

- 00 to represent 0
- 01 to represent 1
- 10 to represent 2

and append 11 to each code to obtain its ternary code $(x)_3$

- $|(x)_3| = 2\lfloor \lg_3(x-1) \rfloor + 2$

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Unary Codes:

- $N = [1110111111001^{17}01^{11}011111111110]$

Ternary Codes:

- $N = [010011\ 100011\ 00\ 01101011$
  $01001011\ 01001011]$

Fibonacci Encoding

Lemma: Zeckendorf's Theorem

Let f_i be the i-th Fibonacci number, then each integer $x > 0$ can be represented as

$$n = \sum_{i=2}^{k} c_i f_i$$

with $c_i \in \{0, 1\}$ and $c_i + c_{i+1} < 2$

Definition: Fibonacci Code

Given an integer $x > 0$ use the sequence of c_i's followed by a 1 as its Fibonacci code $(x)_\phi$

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- 11 does not occur in any sequence
- to compute find largest Fibonacci number $f_i \leq x$ and repeat process for $x - f_i$
- Fibonacci codes are smaller than ternary codes for smaller integers

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- $f_2 = 1, f_3 = 2, f_4 = 3, f_5 = 5, f_6 = 8, f_7 = 13$
- 4: $f_2 + f_4 = 1011$
- 7: $f_3 + f_5 = 01011$
- 1: $f_2 = 11$
- 18: $f_5 + f_7 = 0001011$
- 12: $f_2 + f_4 + f_6 = 101011$

Elias-γ-Encoding [Eli75]

Definition: Elias-γ-Code

Given an integer $x > 0$, its Elias-*gamma*-code $(x)_\gamma$ is

$$(x)_\gamma = 0^{\lfloor \lg x \rfloor}(x)_2$$

- $|(x)_\gamma| = 2\lfloor \lg x \rfloor + 1$ bit
- first part gives length of binary representation
- first bit of $(x)_2$ is one bit

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- encode length of binary representation using Elias-γ code
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Hands-on Elias-Encoding

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Exercise 1

Calculate the **Elias-γ** and **Elias-δ** encoding of **42**.

Exercise 2

Which integer is represented by the following Elias-δ code?

`001010111`

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Definition: Golomb Code

Given an integer $x > 0$ and a constant $b > 0$, the Golomb code consists of

- $q = \lfloor \frac{x}{b} \rfloor$
- $r = x - qb = x \,\%\, b$
- $c = \lceil \lg b \rceil$

with

$$(x)_{\mathrm{Gol}(b)} = (q)_1 (r)_2$$

where $(r)_2$ depends on its size

- $r < 2^{\lfloor \lg b \rfloor - 1}$: r requires $\lfloor \lg b \rfloor$ bits and starts with a 0
- $r \geq 2^{\lfloor \lg b \rfloor - 1}$: r requires $\lceil \lg b \rceil$ bits and starts with a 1 and it encodes $r - 2^{\lfloor \lg b \rfloor - 1}$

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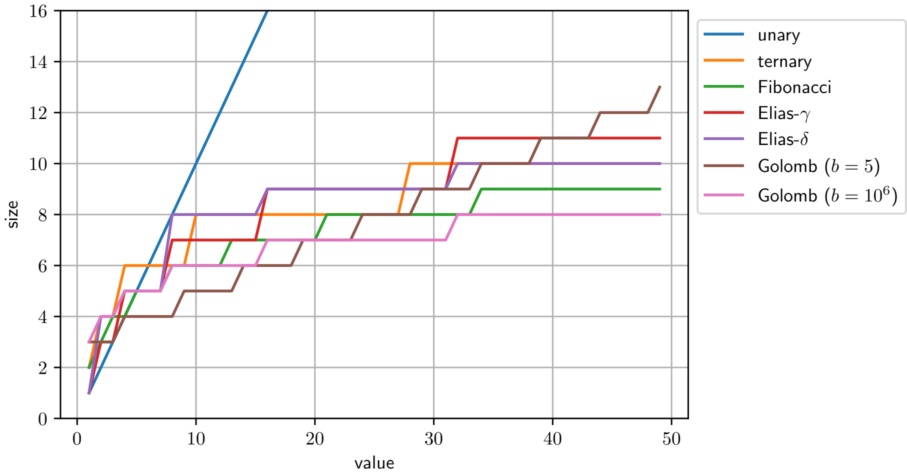
- for $b = 5$, there are 4 remainders: $00, 01, 100, 101$, and 110
- $2^{\lfloor \lg 5 \rfloor - 1} = 2$
- $0, 1 < 2$: 00 and 01 require 2 bits
- $2, 3, 4 \geq 2$: require 3 bits and encode $0, 1, 2$ starting with 1

Comparison of Codes (1/2)



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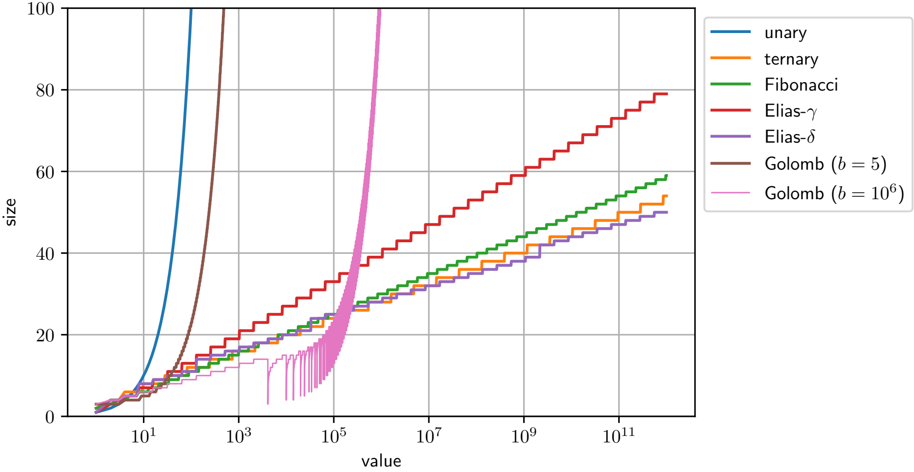

Back to Queries: Conjunctive Queries

Task

- given terms $t_1, \ldots, t_k$
- intersect $L(t_1) \cap L(t_2) \cap \cdots \cap L(t_k)$

- pairwise intersection usually works best
- intersection of two lists is of interest
- start with two shortest and continue like that

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Setting

- two lists M and N with
- $|M| = m$ and $|N| = n$ and
- $m \leq n$

- different algorithms to intersect lists
- assuming lists are Δ encoded

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Zipper

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Intersecting two sorted lists of sizes m and n using zipper requires $O(m + n)$ time.

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Proof (Sketch)

- compare entries until one list is empty
- if $\max\{id : id \in N\} <$ some element in M, then all elements in N are compared
- resulting in $O(n+m)$ time

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Simple Binary Search

- search each document in M in N using binary search

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- binary search not work with Δ-encoding

Binary Search (2/2)

Double Binary Search

- let $p_m = \lfloor \frac{m}{2} \rfloor$
- search for $M[p_m]$ in N using binary search
- let result be position p_n
- if $M[p_m] = N[p_n]$ add $M[p_m]$ to result
- continue recursively by intersecting
  - $M[1, p_m] \cap N[1, p_n]$ and
  - $M[1 + p_m, |M|] \cap N[1 + p_n, |N|]$

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Proof (Sketch)

- look at running time of binary search at each recursion depth
- depth 0: lgn
- depth 1: $2 \lg \frac{n}{2}$
- depth 2: $4 \lg \frac{n}{4}$
- depth m: $m \lg \frac{n}{m}$

Depth of recursion is at most $\lg m$, therefore

- $\sum_{i=0}^{\lg m} \frac{m}{2^i} (\lg \frac{n}{m} + i) = m(\lg \frac{n}{m} \sum_{i=0}^{\lg m} \frac{1}{2^i} + \sum_{i=0}^{\lg m} \frac{1}{2^i})$
- total: $O(m \lg \frac{n}{m})$

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Depth of recursion is at most $\lg m$, therefore

- $\sum_{i=0}^{\lg m} \frac{m}{2^i} (\lg \frac{n}{m} + i) = m(\lg \frac{n}{m} \sum_{i=0}^{\lg m} \frac{1}{2^i} + \sum_{i=0}^{\lg m} \frac{1}{2^i})$
- total: $O(m \lg \frac{n}{m})$

- example on board

Exponential Search

Exponential Search

- assume that $M[1..i]$ have been processed and
- $M[i]$ is closest to $N[j]$ for some j
- now find $M[i+1]$ in N by comparing it to $N[j], N[j+1], N[j+2], N[j+4], \ldots$ until
- $N[j+2^k] \geq M[i+1]$ ℹ if $N[j+2^k = M[i+1]$, we are done with this iteration
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Intersecting two sorted lists of sizes m and n using a exponential search requires $O(m \lg \frac{n}{m})$ time.

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- searching for each element $M[i]$ requires $O(\lg d_i)$ time
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- works well if lists do not fit into main memory
- still not working with Δ-encoding

Engineered Representations

Two-Level Representation

- store every B-th element of the list in top-level
- in addition to Δ-encoded ids
- store original id for each sampled value in id-list

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Karlsruhe Institute of Technology

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Skipper [MZ96]

- scan top-level and
- go down in Δ-encoded list as soon as possible

- avoids complex binary search control structure

- example on board

Intersection with Randomized Inverted Indices [ST07]

- assume ids are in $[0, U)$ with $U = 2^{2u}$
- ids have to be random ℹ more details in paper
- choose tuning parameter B ℹ determine average bucket size
- given a list $N = [d_1, \ldots, d_n]$ and $k_N = \lceil \lg \frac{UB}{n} \rceil$
- per list, represent ids in
  - buckets b_i^N containing
  - partial ids $\{d_j \bmod 2^{k_N} : d_j / 2^{k_N} = i\}$
- due to randomization, average bucket size is between $B/2$ and B
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- for each element $M[i]$ find bucket of N
- can be same bucket as for $M[i-1]$, if so, continue at position of $M[i-1]$ in bucket ℹ continuing is important
- scan bucket until element $\geq M[i]$ is found
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Lemma: Running Time

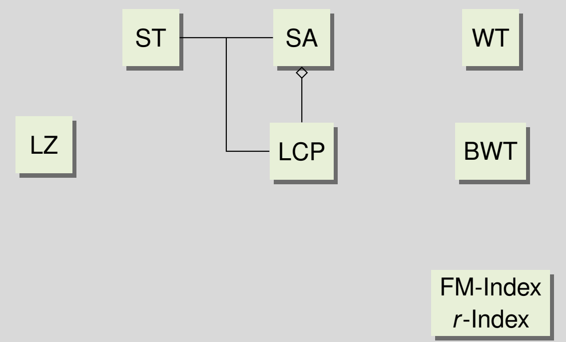
Intersecting two sorted lists of sizes m and n using a randomized inverted indices requires $O(m + \min\{n, Bm\})$ time.

Conclusion and Outlook

This Lecture

- inverted index
- space efficient encodings of document lists
- efficient intersection algorithms

Linear Time Construction



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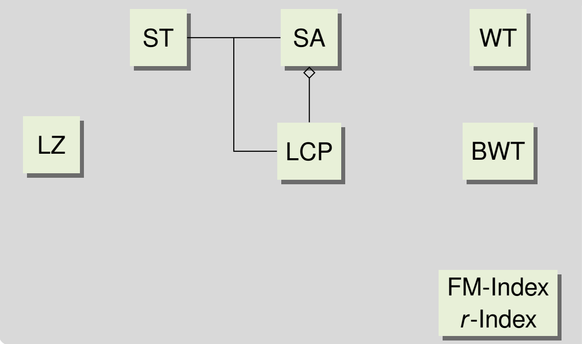
Next Lecture

- longest common extension queries

Linear Time Construction



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