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Efficient Query Processing for Scalable Web Search

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Foundations and Trends® in Information Retrieval

Published, sold and distributed by:

now Publishers Inc.
PO Box 1024
Hanover, MA 02339
United States
Tel. +1-781-985-4510
www.nowpublishers.com
sales@nowpublishers.com

Outside North America:

now Publishers Inc.
PO Box 179
2600 AD Delft
The Netherlands
Tel. +31-6-51115274

The preferred citation for this publication is

N. Tonellotto, C. Macdonald and I. Ounis. *Efficient Query Processing for Scalable Web Search*. Foundations and Trends® in Information Retrieval, vol. 12, no. 4–5, pp. 319–500, 2018.

ISBN: 978-1-68083-543-4

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Volume 12, Issue 4-5, 2018

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Foundations and Trends® in Information Retrieval, 2018, Volume 12, 5 issues. ISSN paper version 1554-0669. ISSN online version 1554-0677. Also available as a combined paper and online subscription.

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Efficient Query Processing for Scalable Web Search

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ABSTRACT

Search engines are exceptionally important tools for accessing information in today's world. In satisfying the information needs of millions of users, the effectiveness (the quality of the search results) and the efficiency (the speed at which the results are returned to the users) of a search engine are two goals that form a natural trade-off, as techniques that improve the effectiveness of the search engine can also make it less efficient. Meanwhile, search engines continue to rapidly evolve, with larger indexes, more complex retrieval strategies and growing query volumes. Hence, there is a need for the development of efficient query processing infrastructures that make appropriate sacrifices in effectiveness in order to make gains in efficiency. This survey comprehensively reviews the foundations of search engines, from index layouts to basic term-at-a-time (TAAT) and document-at-a-time (DAAT) query processing strategies, while also providing the latest trends in the literature in efficient query processing, including the coherent and systematic reviews of techniques such as dynamic pruning and impact-sorted posting lists as well as their variants and optimisations. Our explanations of query processing strategies, for instance the WAND and

BMW dynamic pruning algorithms, are presented with illustrative figures showing how the processing state changes as the algorithms progress. Moreover, acknowledging the recent trends in applying a cascading infrastructure within search systems, this survey describes techniques for efficiently integrating effective learned models, such as those obtained from learning-to-rank techniques. The survey also covers the selective application of query processing techniques, often achieved by predicting the response times of the search engine (known as query efficiency prediction), and making per-query tradeoffs between efficiency and effectiveness to ensure that the required retrieval speed targets can be met. Finally, the survey concludes with a summary of open directions in efficient search infrastructures, namely the use of signatures, real-time, energy-efficient and modern hardware and software architectures.

Acronyms

Here we report the main acronyms used in this survey. Acronyms typeset in **Sans-serif** pertain directly to information retrieval concepts that we explain in this survey.

NDCG	Normalised Discounted Cumulative Gain
MAP	Mean Average Precision
ERR	Expected Reciprocal Rank
MED	Maximised Effectiveness Difference
RBP	Rank Biased Precision
IR	Information Retrieval
QPS	Queries per second
IDF	Inverse Document Frequency
FOR	Frame-Of-Reference
PFOR	Patched FOR
Vbyte	Variable Byte
EF	Elias-Fano
PEF	Partitioned EF
QMX	Quantities, Multiplier and eXtractor

SIMD	Single Instruction Multiple Data
TAAT	Term-At-A-Time
DAAT	Document-At-A-Time
WAND	Weighted AND or Weak AND
BMW	Block-Max WAND
BMM	Block-Max MaxScore
BMA	Block-Max AND
LBMW	Local BMW
VBMW	Variable BMW
QEP	Query Efficiency Prediction/Predictor
QPP	Query Performance Prediction/Predictor
SLA	Service Level Agreement
PESOS	Predictive Energy Saving Online Scheduling
DVFS	Dynamic Voltage and Frequency Scaling
TFIDF	Term Frequency - Inverse Document Frequency
SAAT	Score-At-A-Time
LTR	learning-to-rank
FPGA	Field Programmable Gate Array
IoT	Internet-of-Things
ISN	index serving node

Notations

Here we only report the recurrent notation symbols used in this survey.
Fixed size text is used for pseudocode-related symbols.

R	the number of replicas of a shard.
S	the number of shards of an index.
K	the number of top results returned by a search engine.
s	speedup, used as a performance measure.
r	reduction, used as a performance measure.
d	a document, as indexed by an IR system.
q	a query, as processed by an IR system, i.e., a set of terms.
N	the number of documents indexed by the IR system.
t, t_i	a term, as may exist within a query.
$\text{SCORE}_q(d)$	a generic query-document ranking function.
$s_t(q, d)$	a generic term-document similarity function.
f_t	the document frequency of a term.
IDF_t	the inverse document frequency of a term.
$f_{d,t}$	the number of occurrences of a term in a document.
\perp	special symbol to denote the end of a posting list.

n	number of terms in a query.
$p, \mathbb{I}, \mathbb{O}$	an array of posting lists.
q	a priority queue of docids or $\langle \text{docid}, \text{score} \rangle$ pairs.
A	an accumulators map from docids to scores.
λ	the size of an unordered window complex operator.
p	parallelism degree, i.e., number of threads.
$t(p)$	expected query processing time with p threads.
$\sigma_t(q)$	the term upper bound, a.k.a. its max score.
$\sigma_d(q), \sigma_d$	the document upper bound computed with term upper bounds.
\hat{q}	a set of terms from query q already processed.
θ, Θ	a threshold, i.e., the smallest (partial) score of the current top K documents.
L	parameter of the <code>Quit</code> and <code>Continue</code> strategies.
N_t	the number of documents indexed in a top candidates list.
σ	an array of term upper bounds.
ub	an array of document upper bounds.
pivot	a index of a posting list in p .
pivot_id	the docid of the <code>pivot</code> posting list iterator.
F	the aggressiveness tradeoff of a dynamic pruning strategy.
\mathbf{b}	an array of block lists.
σ_b	a document upper bound computed with block upper bounds.
$s_j(t)$	a QEP term statistic.
A_i	a QEP aggregation function, e.g., max, sum, variance.
$f_{ij}(q)$	a QEP feature defined for query q .
τ	a posting list score threshold.
$A(t_1, t_2)$	size of the intersection of the posting lists of terms t_1 and t_2 .
δ, ϵ, β	small positive constants.
$f_{\text{ins}}, f_{\text{add}}$	filtering thresholds.
w	a weight.
b	the number of bits used to represent impacts.
g, h	fitting parameters for estimation of b .
L, U	global lower and upper bounds on term scores.
Q	a fidelity control knob.
ρ	number of postings to process.
M	a standard evaluation metric.
f_i, \mathbf{f}	a feature id.
\mathcal{F}	a feature id set.
\mathbf{x}	a feature vector.
T_i	a regression/decision tree.

\mathcal{T}	a set of regression/decision trees.
w_i	the weight of a regression/decision tree.
d_T	the depth of tree T .
s_i	a tree score contribution.
n_i	a branching node of a regression/decision tree.
$e_i(\mathbf{x})$	the exit leaf of a tree for a given feature vector.
\mathcal{N}_i	the set of branching nodes of a tree.
\mathcal{L}_i	the set of leaf nodes of a tree.
γ	a threshold value.
a	a array of two elements.
tid	an array of tree ids.
mask	an array of mask bitvectors.
th	an array of threshold values.
exit	an array of leaf bitvectors.
scores	a lookup table of scores.
\mathcal{Q}	a set of queries.

1

Introduction

Search engines are exceptionally important tools for accessing information in today's increasingly digital world. Classical commercial Web search engines, such as those maintained by Google, Bing, Yandex, Baidu, have processed billions if not trillions of Web documents, and have kept maintaining these in continuously updated index data structures¹ requiring petabytes of storage space,² to ensure *satisfying* the users of the search engine through billions of user queries received every month³ (Bosch *et al.*, 2016).

Satisfaction of the search engine users is a key metric for search engine providers. Without drawing too broad a sweeping generalisation, one of the fundamental goals of a search engine is to derive income from advertising traffic, for instance from the ads that are often presented next to the organic search results. Users that are not satisfied with the search engine results may switch to a different engine (White, 2016), and may not return. This is a loss of advertising revenue for the search

¹<https://www.google.com/insidesearch/howsearchworks/thestory/index.html>

²<https://www.google.com/insidesearch/howsearchworks/crawling-indexing.html>

³<https://googleblog.blogspot.it/2010/09/google-instant-behind-scenes.html>

engine. As a consequence, ensuring that their users are satisfied with the results is of utmost importance to search engines.

There are various reasons why the result page for a search does not satisfy a user (Diriye *et al.*, 2012), but the primary causes are the *effectiveness* – the quality of the returned results – and the *efficiency* – the speed at which the results were returned. Indeed, search engines that are slow to return results to users can negatively damage the user's perception of the quality of the results (Brutlag and Schuman, 2009). Hence, a search engine needs to be both effective (deploying advanced ranking mechanisms), while ensuring that its results are efficiently returned to the user. A key contribution of this survey is to review both the foundational background and the recent advances in search engine infrastructures.

Fortunately, search is a parallelisable problem, and scaling can be applied to the search engine computing infrastructure. Indeed, as shown in Figure 1.1, a large index can be partitioned across multiple *shards*, allowing each single search engine server to service a small portion of the index in order to ensure fast retrieval. Each of the S index shards can be replicated R times, allowing both resilience and scaling. When user queries arrive, the *broker* routes queries to the less loaded replica of each shard for processing (Freire *et al.*, 2013; Freire *et al.*, 2012).

Using such a distributed setting for a large search engine, $R \times S$ can be very large, covering potentially hundreds of thousands of servers. All of the major search engines run exceedingly large data centres, each often requiring capital investments of billions of dollars,⁴ and consuming vast quantities of energy. Data centres use 3% of the global electricity supply and account for about 2% of the total greenhouse gas emissions; this is expected to triple in the next decade, putting an enormous strain on energy supplies and dealing a hefty blow to efforts to contain global warming.⁵

⁴[http://www.datacenterknowledge.com/archives/2014/07/23/
from-112-servers-to-5b-spent-on-google-data-centers-per-quarter](http://www.datacenterknowledge.com/archives/2014/07/23/from-112-servers-to-5b-spent-on-google-data-centers-per-quarter)

⁵<http://www.independent.co.uk/environment/global-warming-data-centres-to-consume-three-times-as-much-energy-in-next-decade-experts-warn-a6830086.html>

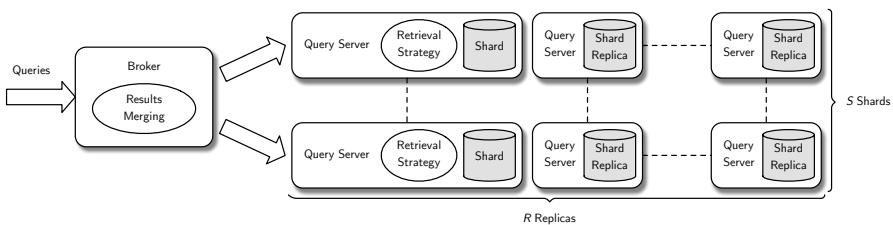


Figure 1.1: Distributed retrieval architecture.

Clearly, at such large scales, the efficiency of the search engine’s operating internals are therefore key to the operating costs of such companies. Efficiency improvements of 5% would allow a 5% reduction in R replicas, potentially equating to significant power consumption reductions, and providing a room for further growing the sizes of the search engines’ indexes, or servicing growth in the user queries.

The distributed nature of a search engine infrastructure is not within the scope of this survey. The interested reader can find a comprehensive overview of distributed large-scale Web search engines in (Cambazoglu and Baeza-Yates, 2015). Instead, this survey focuses on the general architecture of a search infrastructure as might be deployed within a single server. Our goal is to provide an accurate description of the basic search components involved in the scoring of documents in response to a query, together with a detailed and exhaustive review of the research works aiming at boosting the efficiency of query processing without negatively impacting the effectiveness performance of the system.

A key detail of the manner in which a search engine is designed to operate is the “top-heavy nature” of results: since the users of search engines typically focus on the top-ranked results (as can be measured offline using test collections and metrics such as NDCG (Järvelin and Kekäläinen, 2002) and ERR (Chapelle *et al.*, 2009)), the relevance of those results is key to user satisfaction. This means that the search engine should itself focus on getting the most relevant results at the top of the ranking, at the possible detriment of mis-ranking other results. In his SIGIR 2010 Industry Day talk, Pedersen (2010) described this process as the use of cascading (illustrated in Figure 1.2). In response to a query, each conceptual cascade aims to filter or rank documents,

before passing onto the next cascade layer. At the bottom layer, the documents to be retrieved are defined in terms of the subsets of terms present in the query – being able to identify these subsets as quickly as possible, without requiring to scan the contents of each document, is a fundamental architecture decision of an Information Retrieval (IR) system. The bottom layer may filter a collection of billions of documents down to the millions, which should be scored. In the second layer, query processing techniques define how the scoring of document weighting models, such as language modelling or BM25 should be applied. In the final layer (the top layer), various additional ranking features such as PageRank, or URL information may be calculated and used within a learned model to re-rank the documents, before presenting the final top K high-scored documents to the user (usually K is small, e.g., 8 – 20, as displayed on the first page of the search results).

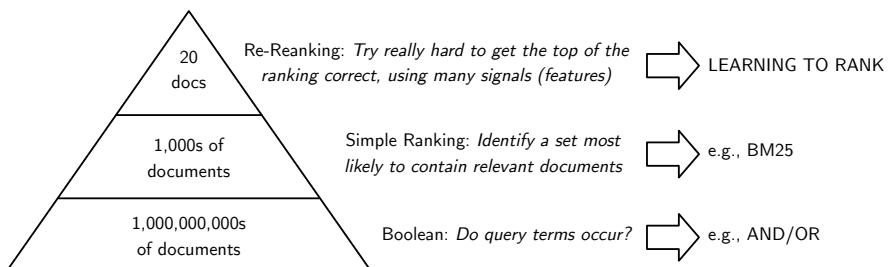


Figure 1.2: Cascading nature of Web search, based on (Pedersen, 2010)

Different techniques are appropriate at different cascade levels, but many are designed to make efficiency savings by avoiding the scoring of documents, which cannot make the top-ranked results that will be returned to the user. In this survey, we cover both the core algorithms and data structures used for retrieval, as well as the optimisations (such as dynamic pruning) that can be applied at a given cascade level. Of course, not all queries are equal – some are easier for the search engine to answer *effectively*, while, orthogonally, some may be less *efficient*, i.e., take longer for the search engine to answer. Being able to know the likely efficiency of a query, as might be obtained from a *query efficiency predictor*, can allow the search engine to make on-the-fly decisions about its configuration.

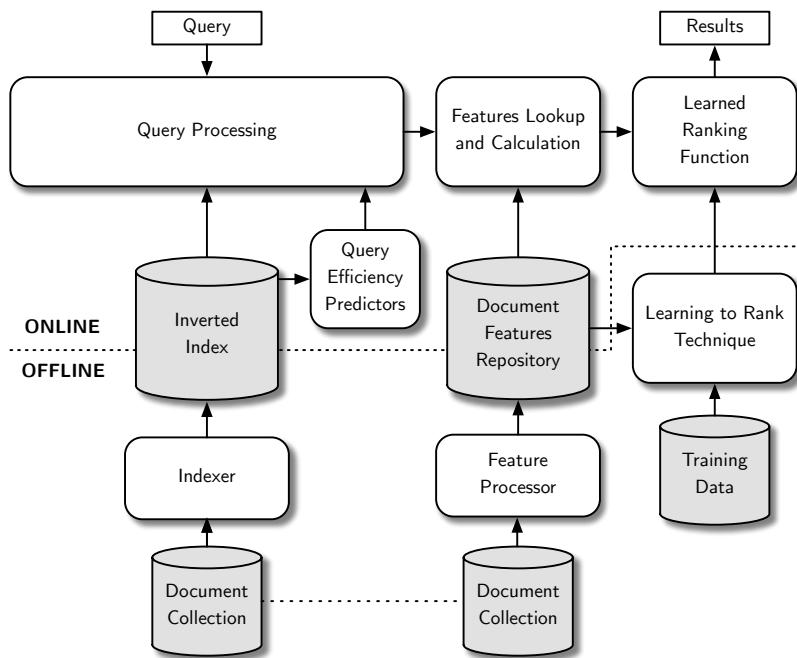


Figure 1.3: A conceptual architecture for a search engine.

Figure 1.3 provides the main infrastructure that is discussed in this survey. We will focus on the “online” components, e.g., those responsible for the cascading components of search, while referring to the “offline” components whenever it is necessary. The remainder of this survey is structured as follows:

- Chapter 2 provides an overview of the modern infrastructure foundations within a search engine, covering the basic form of the inverted index data structure, and the essentials of query processing.
- Chapter 3 provides an introduction to approaches for increasing the efficiency of query processing, namely the dynamic pruning techniques.
- Chapter 4 describes query efficiency predictors – a new technique to estimate the response time of queries – that is gaining attention

for a number of applications involving efficient retrieval on a per-query basis.

- Chapter 5 provides an overview of impact-sorted indexes, which make offline changes to the layout of the inverted index in order to improve the efficiency of query processing.
- Chapter 6 provides an overview of cascading search architectures, and provides insights into how to efficiently deploy learning-to-rank, a retrieval technique known to benefit the search engine’s effectiveness by re-ranking a set of K documents.
- Chapter 7 gives an overview of the current open directions in retrieval infrastructures, including the use of signature files instead of inverted indexes, and provides concluding remarks.

Note on Efficiency Performance Measures

In this survey, we illustrate the efficiency measures reported in the cited papers. Since this survey covers papers from over a period of 30 years, comparing the reported results across different papers could lead to the wrong conclusions. Hence, we will only report comparative performance measures derived from single contributions.

The performances of the discussed strategies naturally depend on several factors, such as the index and/or the query characteristics, the inverted index compression, the similarity function adopted, the number of documents returned, the actual underlying implementations, the machine(s) used to perform the experiments and so on. In most papers, when comparing the efficiency of different solutions, two main quantities are typically reported: response times and/or number of processed elements. In order to be as “implementation-independent” as possible, we report the speedup of an optimisation w.r.t. the baseline, in terms of mean response time, and/or its (work) *reduction*, defined as the percentage of postings that are dynamically pruned, i.e., not scored, w.r.t. the baseline.

When comparing two time quantities t_1 and t_2 , with $t_1 > t_2$ we will always report their relative *speedup* s , defined as $s = t_1/t_2$ (always greater than 1). For example, if two strategies A and B have an average response time of 20 ms and 8 ms, respectively, their speedup (of B

w.r.t. to A) is $s = t_A/t_B = 20/8 = 2.5\times$. When comparing two numbers of processed elements n_1 and n_2 , with $n_1 > n_2$ we will systematically report the percentage *reduction* r , defined as $r = 1 - n_2/n_1$. For example, if strategy A processes 200 elements while strategy B processes just 150 elements, the reduction of B w.r.t. A is $r = 1 - n_B/n_A = 1 - 150/200 = 0.25 = 25\%$.

Finally, the throughput of a query processing node, as well as that of more complex search systems, is measured in *queries per second* (QPS).

Intended Audience

This survey targets readers, researchers and engineers who possess a basic knowledge in Information Retrieval (IR) or in other cognate topics (e.g., databases, data mining). In particular, the survey is of utmost interest to PhD students, researchers and practitioners working on efficiency and system infrastructures in IR and Web search. Indeed, anyone working on search and ranking on big data will benefit from this manuscript. The survey is also particularly of interest to lecturers and tutors looking for a concise and comprehensive textbook on state-of-the-art query processing techniques to support their IR course.

Note on the Origins of the Material

This survey is a new piece of work, but builds upon our research experience in this area. This survey also benefits from the authors' experience acquired from presenting two related tutorials at ECIR 2017 and SIGIR 2018. We would like to thank the attendees of these tutorials for their insightful questions and comments.

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