

Web Crawling

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Slides created by *Aécio Solano Rodrigues Santos* and *Nivio Ziviani*
based on the survey *Web Crawling* from *Foundations and Trends in Information Retrieval* (2010).

Summary

Introduction

Crawler Architecture

Crawl Ordering Problem

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- ▶ A *web crawler* (also known as a *robot* or a *spider*) is a system for the downloading of web pages.
- ▶ They are used for a variety of purposes:
 - ▶ Web Search Engines
 - ▶ Web Archiving
 - ▶ Web Data Mining
 - ▶ Web Monitoring

Introduction

- ▶ The basic algorithm is simple. Given a set of seed URLs:
 1. downloads all the web pages addressed by the URLs;
 2. extracts the hyperlinks contained in the pages;
 3. iteratively downloads the web pages addressed by these hyperlinks.
- ▶ Despite the apparent simplicity of this basic algorithm, web crawling has many inherent challenges.

Challenges

- ▶ **Scale**

- ▶ The web is very large and continually evolving.
- ▶ Crawlers that seek coverage and freshness must achieve extremely high throughput, which poses difficult engineering problems.

- ▶ **Content selection tradeoffs**

- ▶ Crawlers do not purport to crawl the whole web, or keep up with all the changes.
- ▶ Goals: acquire high-value content quickly, ensure coverage of all reasonable content, and bypass low-quality, irrelevant, redundant, and malicious content.
- ▶ The crawler must balance coverage and freshness, while obeying constraints such as per-site rate limitations.

Challenges

- ▶ **Social obligations**

- ▶ Crawlers should not impose too much of a burden on the web sites they crawl.
- ▶ Without safety mechanisms a high-throughput crawler can inadvertently carry out a *denial-of-service attack*.

- ▶ **Adversaries**

- ▶ Some content providers inject useless or misleading content into the corpus assembled by the crawler.
- ▶ Motivation: financial incentives, for example (mis)directing traffic to commercial web sites.

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Architecture Overview

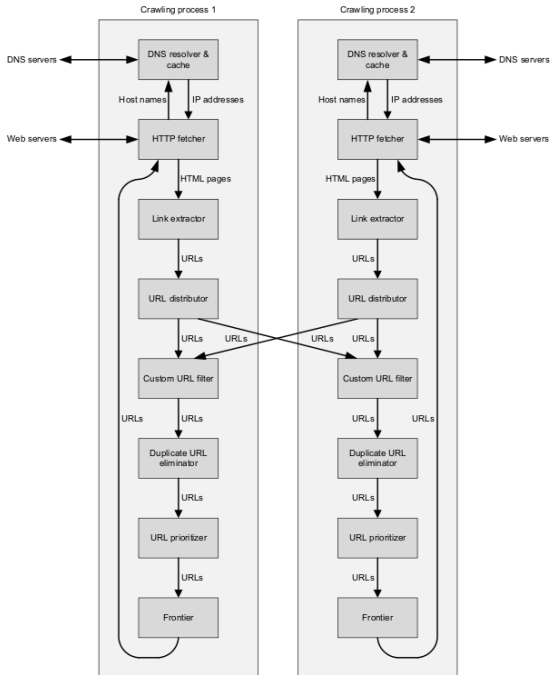
- ▶ Consists of multiple processes running on different machines connected by a high-speed network.
- ▶ Each process consists of multiple worker threads.
- ▶ Each worker thread performs repeated work cycles.
- ▶ At each work cycle, a worker obtains a URL from the **Scheduler** or *Frontier*, which organizes URLs according to priority and politeness policies.
- ▶ The worker thread invokes the **HTTP fetcher**:
 - ▶ It calls a DNS module to resolve the host component of the URL into the IP address of the corresponding web server
 - ▶ Connects to the web server and checks for robots exclusion files and attempts to download the web page.

Architecture Overview

- ▶ If the download succeeds the web page is stored in a repository.
- ▶ The **Link extractor** parses the HTML content of the page and extracts hyperlinks.
- ▶ The extracted URLs are passed to a **URL distributor**, which assigns each URL to a crawling process.
- ▶ This assignment is typically made by hashing the URLs host component, its domain, or its IP address (requires additional DNS resolutions).
- ▶ Most hyperlinks refer to pages on the same web site, thus assignment to the local crawling process is the common case.

Architecture Overview

- ▶ The URL passes through:
 - ▶ **Custom URL filter**: to exclude URLs belonging to “black-listed” sites and URLs with particular file extensions that are not of interest
 - ▶ **Duplicate URL eliminator**: maintains the set of all URLs discovered so far and passes on only never-before-seen URLs.
- ▶ The **URL prioritizer** selects a position for the URL in the Frontier or Scheduler, based on estimated page importance or rate of change.



Key Design Points

- ▶ Any web crawler needs to keep track the URLs.
- ▶ Operations that must be supported:
 - ▶ Adding a new URL
 - ▶ Retrieving a URL
 - ▶ Marking a URL as downloaded
 - ▶ Testing whether the set contains a URL
- ▶ In-memory data structures (e.g., trees or sorted lists) exceed the amount of memory available on a single machine.

Key Design Points

- ▶ Solution: maintain the data structure on disk.
- ▶ However, cost of accessing items in the set (e.g., set membership test) involves an expensive disk seek.
- ▶ Every modern web crawler splits the crawl state into:
 - ▶ **URL-seen test** or **Duplicate URL eliminator**: maintains the set of URLs that have been discovered (whether downloaded or not)
 - ▶ **Scheduler**: maintains the set of URLs that have yet to be downloaded.

Scheduler Data Structure and Politeness

- ▶ A straightforward implementation is a First-in-First-out (FIFO) queue, which results in a breadth-first traversal of the web graph.
- ▶ However, this simple approach has drawbacks:
 - ▶ Most hyperlinks refer to another page on the same web server, resulting in many consecutive HTTP requests to that server.
 - ▶ A barrage of requests is considered “impolite”, and may end in a denial-of-service attack.

Scheduler Data Structure and Politeness

- ▶ One solution: multithreaded or distributed crawler that issues many HTTP requests in parallel.
- ▶ Avoid issuing multiple overlapping requests to the same server.
 - ▶ Maintain a mapping from web servers to crawling threads, e.g., by hashing the host component of each URL.
 - ▶ Each crawling thread has a separate FIFO queue, and downloads only URLs obtained from that queue.

Scheduler Data Structure and Politeness

- ▶ Politeness policy: space out requests to each web server according to that server's capabilities.
 - ▶ E.g., delay subsequent requests by a multiple (say $10\times$) of the time it took to download the last page from that server.
- ▶ This policy ensures that:
 - ▶ The crawler consumes a bounded fraction of the web server's resources.
 - ▶ Fewer pages will be downloaded from slow or poorly connected web servers than from fast, responsive web servers.

Scheduler Data Structure and Politeness

- ▶ It may be desirable to prioritize pages according to their estimated usefulness, based on:
 - ▶ PageRank
 - ▶ Traffic they receive
 - ▶ Reputation of the web site
 - ▶ Rate at which the page has been updated in the past
 - ▶ Etc.

URL Seen Test

- ▶ The second major data structure: **URL-seen test** (UST) or the **duplicate URL eliminator** (DUE)
- ▶ It keeps track of the set of URLs that have been previously discovered and added to frontier.
- ▶ UST needs to support:
 - ▶ Insertion
 - ▶ Set membership testing
- ▶ In a continuous crawling setting, it must also support deletion to cope with URLs that no longer point to a valid page.

URL Seen Test

- ▶ In a disk-based hash table, each lookup requires a disk seek, severely limiting the throughput.
- ▶ Caching popular URLs can increase the throughput.
- ▶ However, the average web page contains close to hundred links and each link needs to be tested for novelty.
- ▶ Implementations performing random file accesses perform poorly, but those that perform streaming sequential reads or writes achieves good throughput.

URL Seen Test

- ▶ The IRLbot crawler [84] uses:
- ▶ Batch of URLs arriving at the DUE is written to disk, distributed over multiple files keyed by the prefix of each hash.
- ▶ Once the size of the largest file exceeds a certain threshold, the files that together hold the batch are read back into memory one by one and merge-sorted into the main URL hash file on disk.

Auxiliary Data Structures: Robots File

- ▶ *Robots Exclusion Protocol*: allows an administrator to bar crawlers from crawling the site, or pages within the site.
- ▶ Provides a file at URL `/robots.txt` containing rules that specify which pages the crawler is allowed to download.
- ▶ A crawler should check whether the site supplies a `/robots.txt` file, and if so, adhere to its rules.
- ▶ To avoid repeatedly requesting `/robots.txt`, crawlers cache the results of previous requests of that file.

Auxiliary Data Structures: DNS

- ▶ URLs contain a host component (e.g., `www.yahoo.com`), which is “resolved” using the Domain Name Service (DNS) protocol.
- ▶ DNS requests can take quite a long time due to the request-forwarding nature of the protocol.
- ▶ Therefore, crawlers often maintain their own DNS caches.

Incremental Web Crawling

- ▶ Web crawlers can be used to:
 - ▶ Assemble one or more static snapshots of a web corpus (batch crawling)
 - ▶ Perform *incremental* or *continuous crawling*: download newly discovered pages and re-download previously crawled pages.
- ▶ Efficient incremental crawling requires a few changes to the major data structures of the crawler.
 - ▶ The DUE should support the deletion of URLs that are no longer valid (e.g., that result in a 404 HTTP return code).
 - ▶ URLs are retrieved from the scheduler and downloaded as in batch crawling, but they are subsequently reentered into the scheduler.

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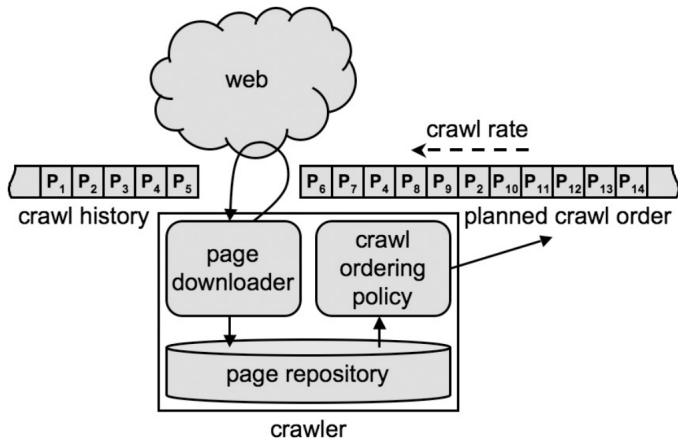
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Crawl Ordering Problem

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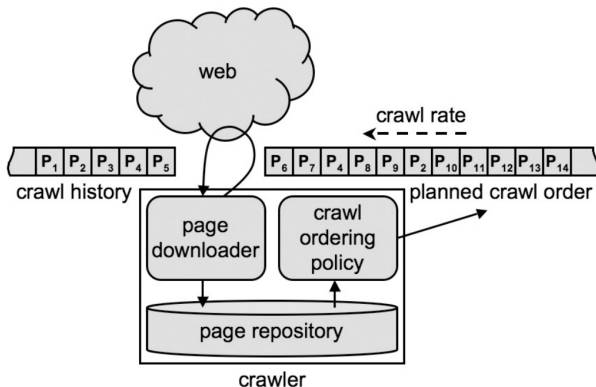
- ▶ The crawl order is extremely important:
 - ▶ due to the growth rate of new content
 - ▶ due to dynamically generated content
- ▶ A good crawler order must consider:
 - ▶ **Coverage**. The fraction of desired pages that the crawler acquires successfully.
 - ▶ **Freshness**. The degree to which the acquired page snapshots remain up-to-date, relative to the current “live” web copies.

Simplified Crawl Ordering Model



Model

- ▶ At a given point in time, some historical crawl order has already been executed (P1, P2, P3, P4, P5 in the diagram).
- ▶ Some future crawl order has been planned (P6, P7, P4, P8, P9, P2, P10, P11, P12, P13, P14, ...).



Model

- ▶ Pages downloaded by the crawler are stored in a *repository*.
- ▶ The future crawl order is determined, at least in part, by analyzing the repository.
- ▶ The content of a web page is subject to change over time.
- ▶ It is sometimes desirable to re-download a page that has already been downloaded, to obtain a more recent snapshot of its content.

Model: Two Approaches

- ▶ **Batch crawling:**

- ▶ The crawl order does not contain duplicate occurrences of any page
- ▶ The entire crawling process is periodically halted and restarted as a way to obtain more recent snapshots of previously crawled pages.

- ▶ **Incremental crawling:**

- ▶ Pages may appear multiple times in the crawl order.
 - ▶ Crawling is a continuous process that conceptually never terminates.
- ▶ Most modern commercial crawlers perform incremental crawling, which is more powerful because it allows re-visitation of pages at different rates.

Web Characteristics

- ▶ One notable study is by Broder et al. [26], which uncovered a “bowtie” structure consisting of:
 - ▶ a central strongly connected component (the core).
 - ▶ a component that can reach the core but cannot be reached from the core.
 - ▶ a component that can be reached from the core but cannot reach the core.
- ▶ In addition, there are a number of small, irregular structures such as disconnected components and long “tendrils”.

Web Characteristics

- ▶ In an earlier study, Broder et al. [28] showed that there is an abundance of near-duplicate content of the web.
- ▶ Using a corpus of 30 million web pages collected by the AltaVista crawler, they found that:
 - ▶ 29% of the pages were more than 50% similar to other pages in the corpus
 - ▶ 11% of the pages were exact duplicates of other pages.
- ▶ Sources of near-duplication include mirroring of sites (or portions of sites) and URL synonymy.

Taxonomy of Crawl Ordering Policies

- ▶ Next figure presents a high-level taxonomy of published crawl ordering techniques.
- ▶ The first group of techniques focuses exclusively on ordering pages for first-time downloading, which affects *coverage*.
 - ▶ Can be applied either in the batch crawling scenario, or in the incremental crawling scenario in conjunction with a separate policy of the second group.
- ▶ The second group of techniques governs re-downloading of pages to maintain *freshness*.
- ▶ Techniques in the third group consider the combined problem of interleaving first-time downloads with re-downloads, to balance coverage and freshness.

Taxonomy of Crawl Ordering Policies

Technique	Objectives		Factors considered		
	<i>Coverage</i>	<i>Freshness</i>	<i>Importance</i>	<i>Relevance</i>	<i>Dynamicity</i>
Breadth-first search [43, 95, 108]	✓				
Prioritize by indegree [43]	✓		✓		
Prioritize by PageRank [43, 45]	✓		✓		
Prioritize by site size [9]	✓		✓		
Prioritize by spawning rate [48]	✓				✓
Prioritize by search impact [104]	✓		✓	✓	
Scoped crawling (Section 4.2)	✓			✓	
Minimize obsolescence [41, 46]		✓	✓		✓
Minimize age [41]		✓	✓		✓
Minimize incorrect content [99]		✓	✓		✓
Minimize embarrassment [115]		✓	✓	✓	✓
Maximize search impact [103]		✓	✓	✓	✓
Update capture (Section 5.2)		✓		✓	✓
WebFountain [56]	✓	✓			✓
OPIC [1]	✓	✓	✓		

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