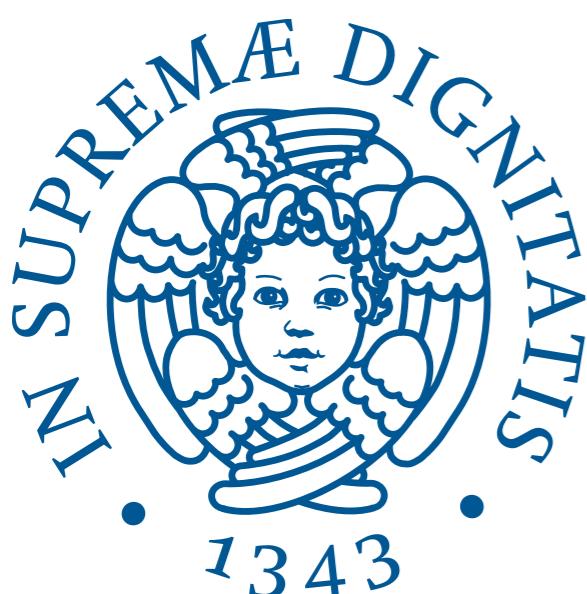


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**Giulio Ermanno Pibiri**

giulio.pibiri@di.unipi.it

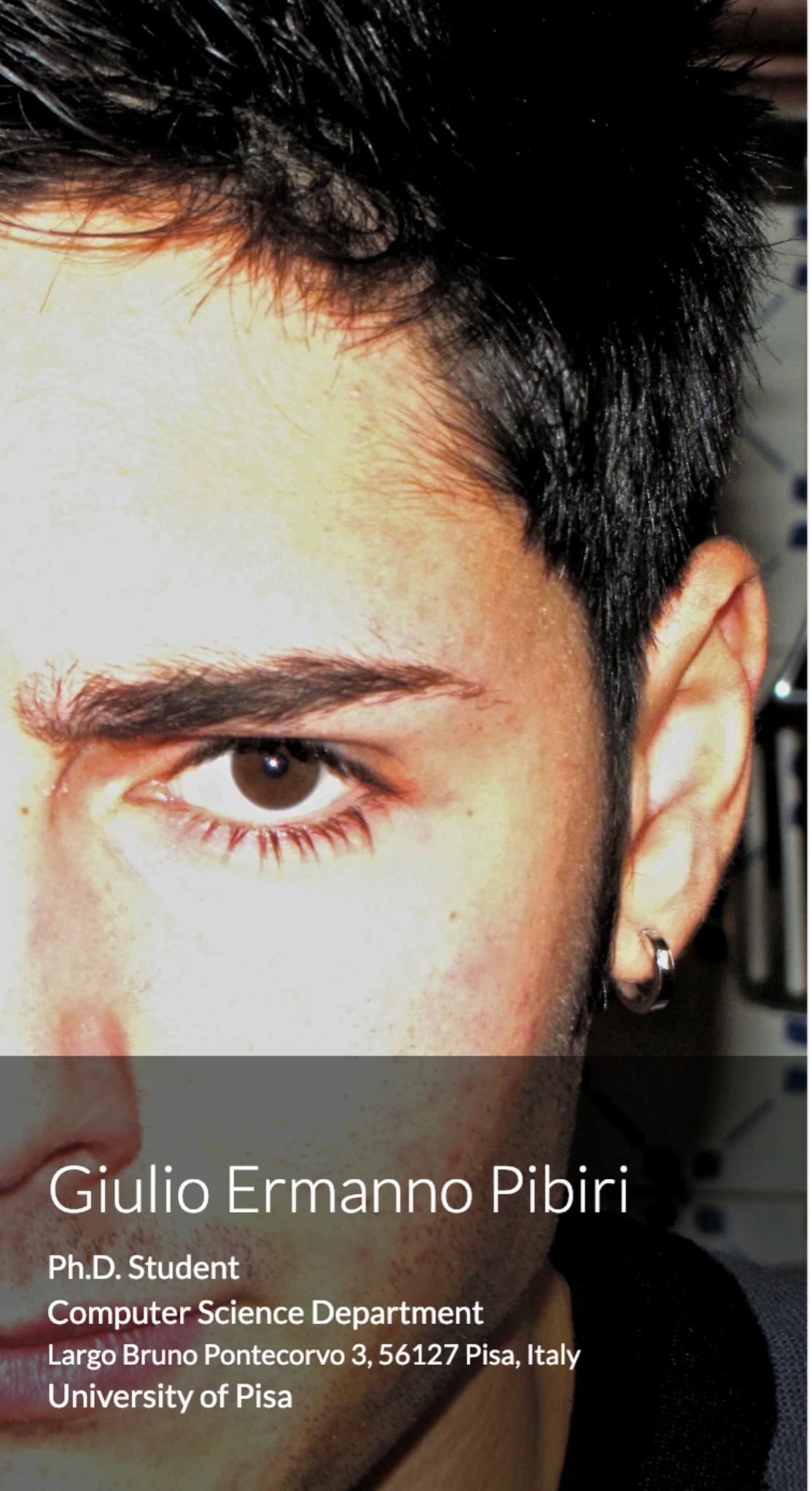
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Department of Computer Science  
University of Pisa

01/02/2019





# Giulio Ermanno Pibiri

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University of Pisa

SPACE AND TIME-EFFICIENT  
DATA STRUCTURES  
FOR MASSIVE DATASETS

by  
Giulio Ermanno Pibiri

SUPERVISOR

Rossano Venturini

REFEREE  
Daniel Lemire



REFEREE  
Simon Gog



2018

Giulio Ermanno Pibiri

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PH.D. THESIS

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ISTITUTO DI SCIENZA E TECNOLOGIE  
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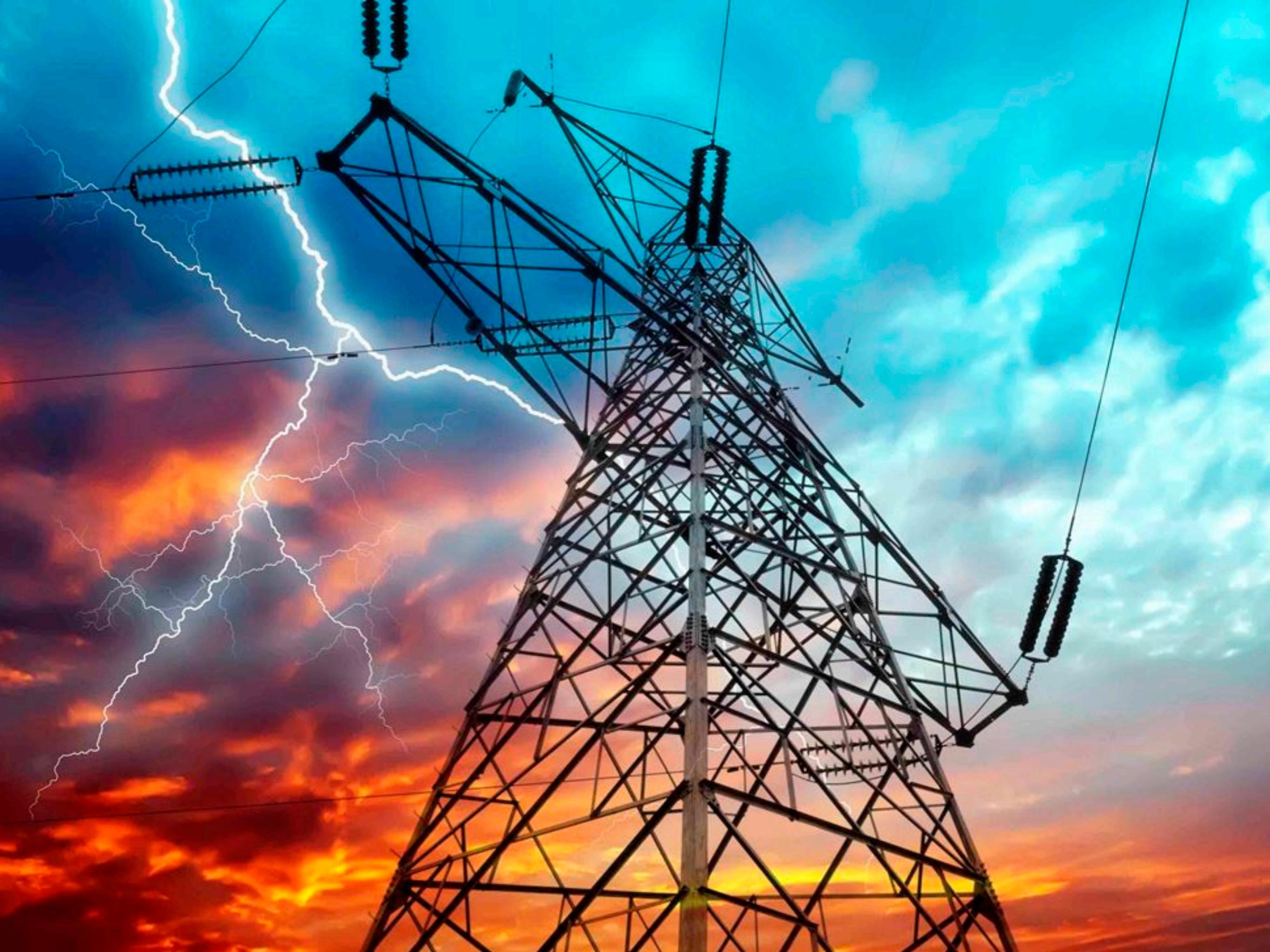


Raffaele Perego

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tutorial c++



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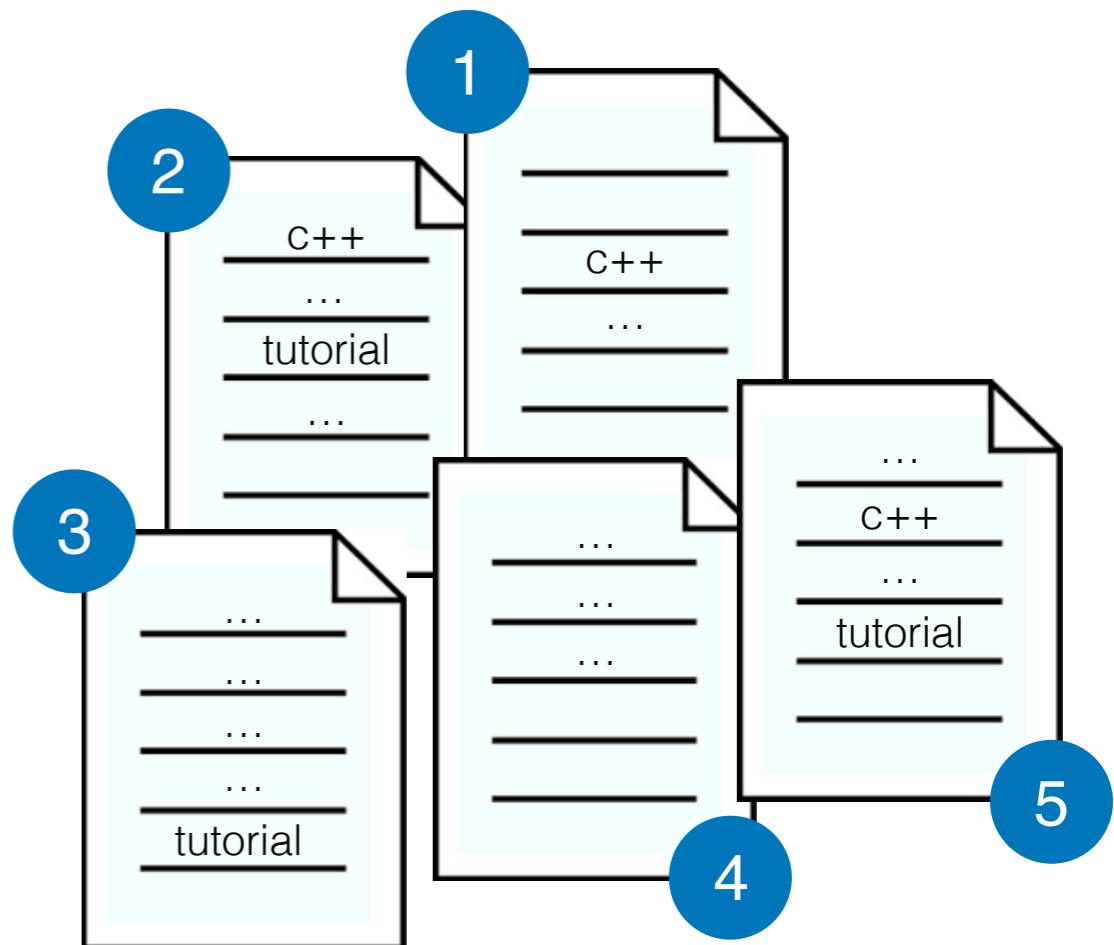
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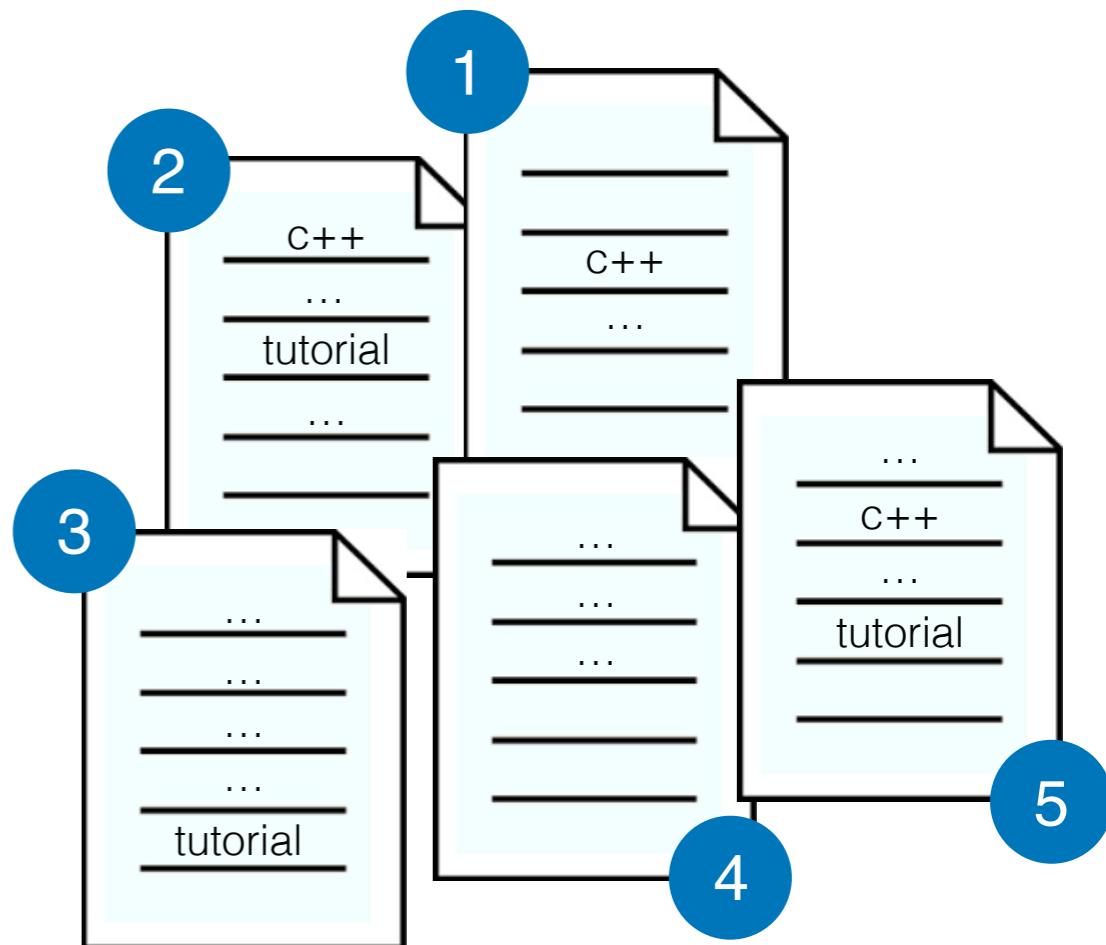
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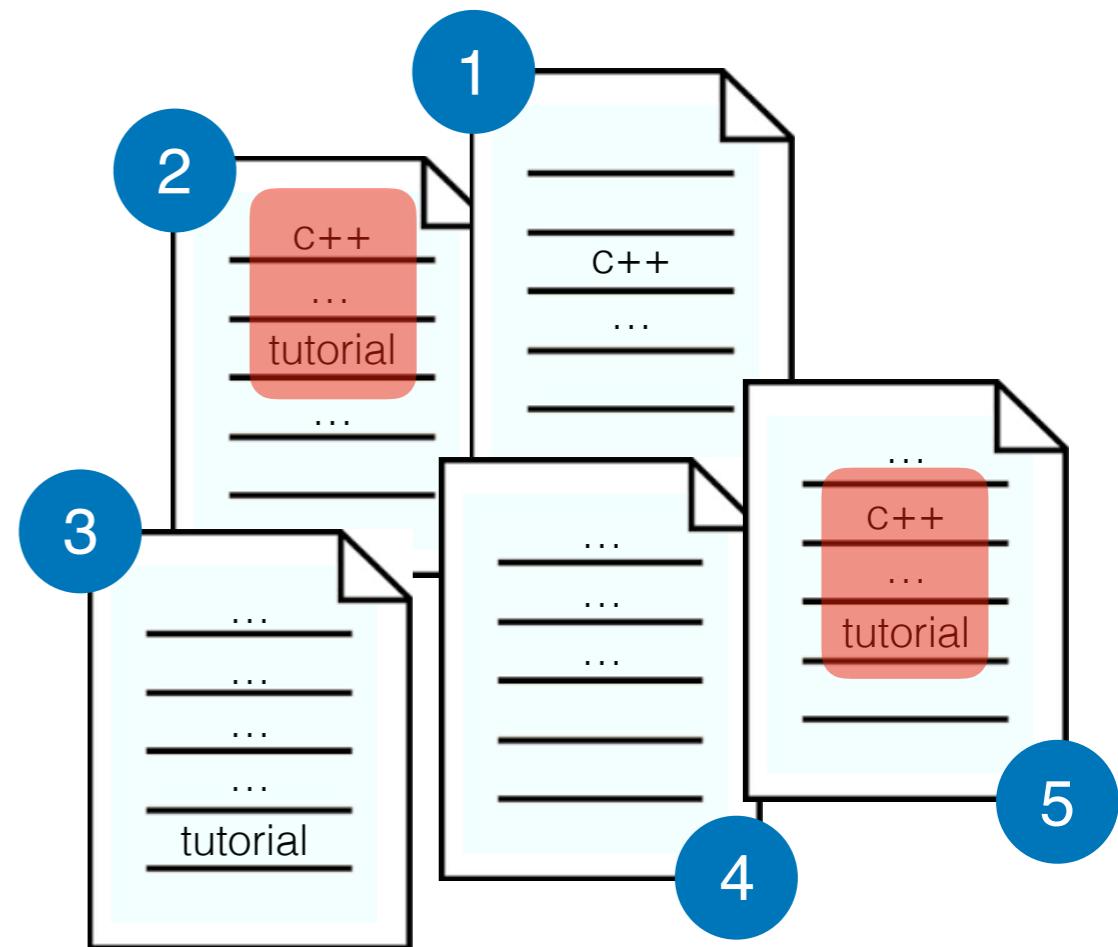
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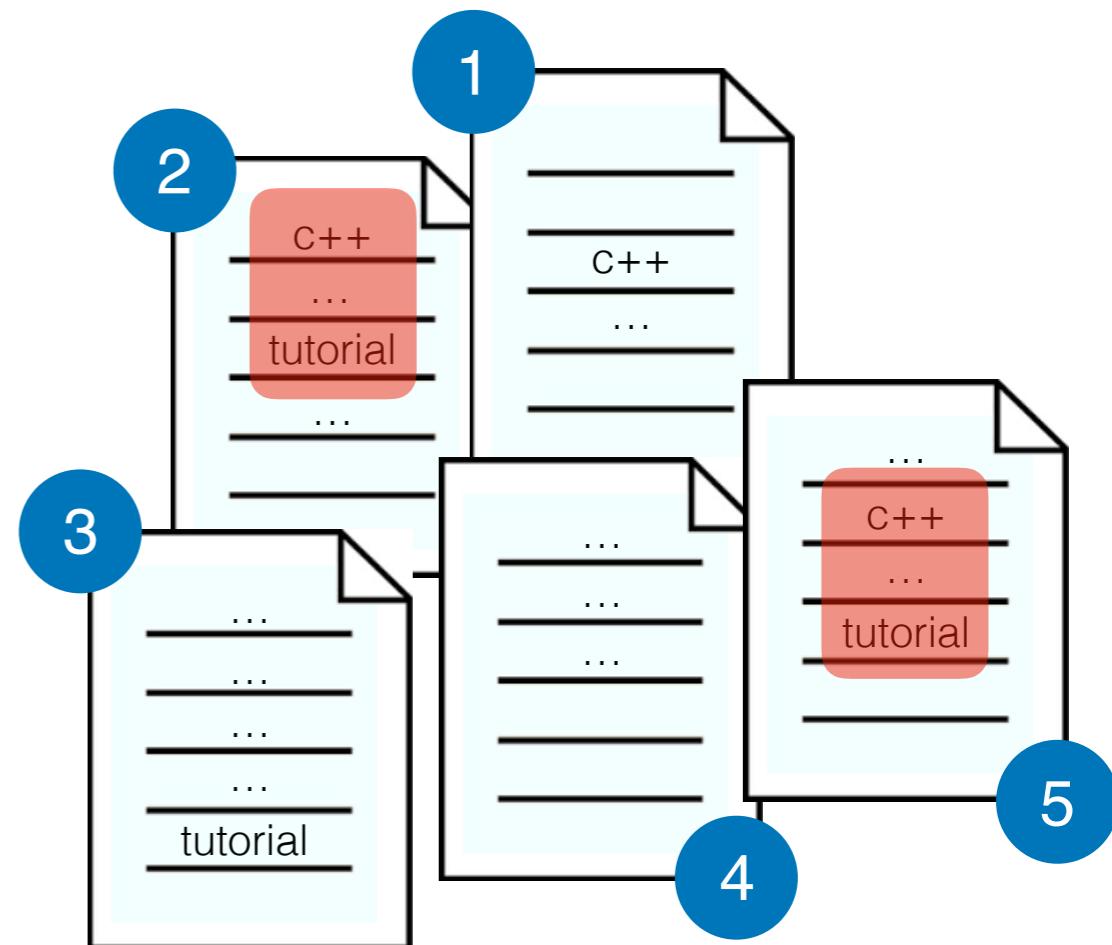
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**tutorial** → [2, 3, 5]

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Inverted Index



**Space**

**Time**

**Interpolative  
(2000)**

**Variable-Byte  
(1972)**

Spectrum

**~3X** smaller

**~4.5X** faster

**Space**

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**As small as Interpolative  
and much faster?**

**1**

**ACM TOIS 2017**

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What about **both** objectives at  
the same time?!

3

**ACM WSDM 2019**

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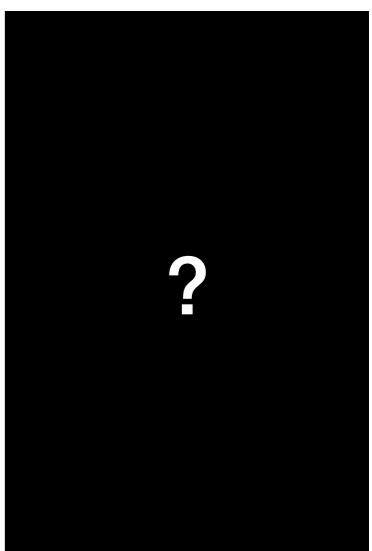
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**ACM WSDM 2019**

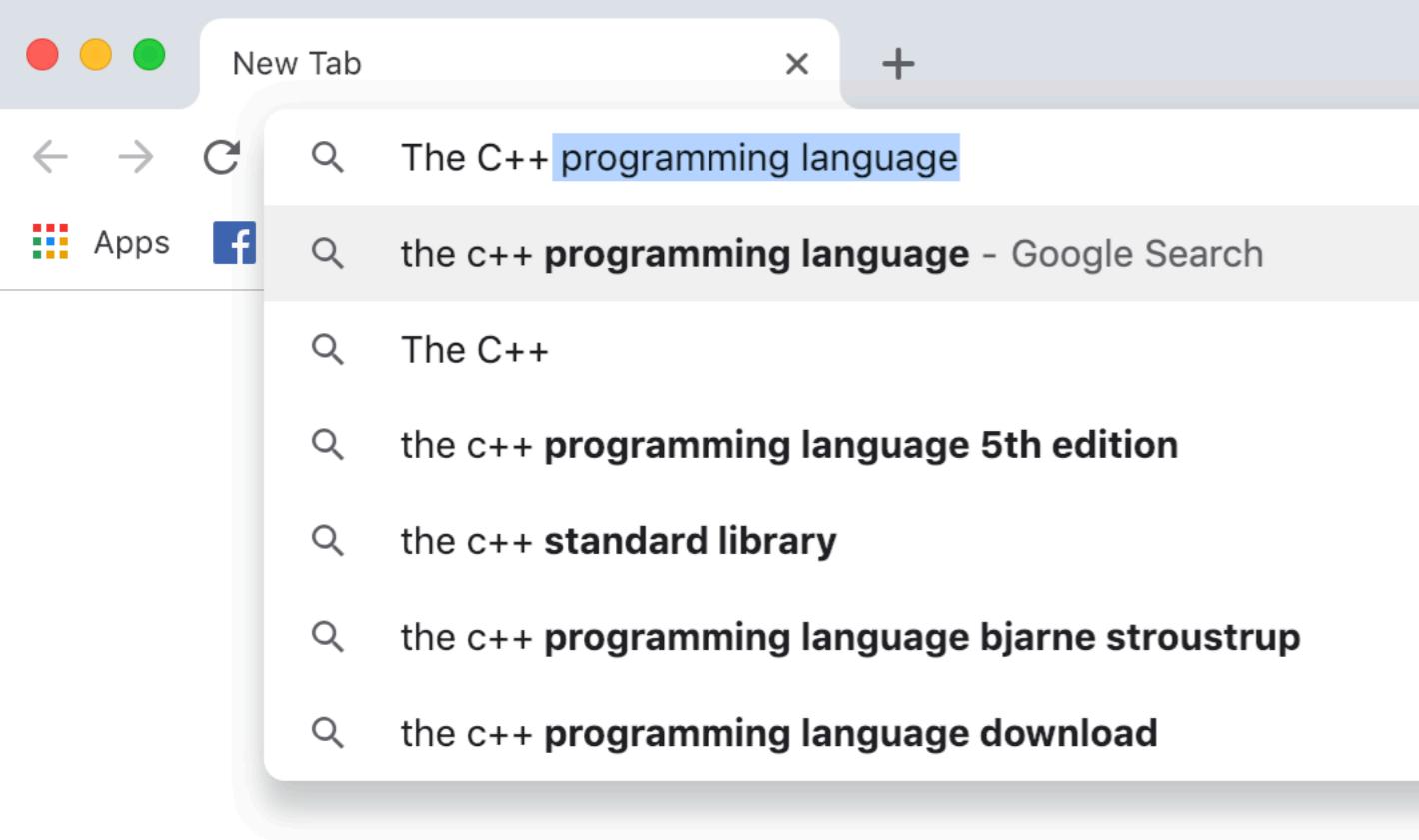


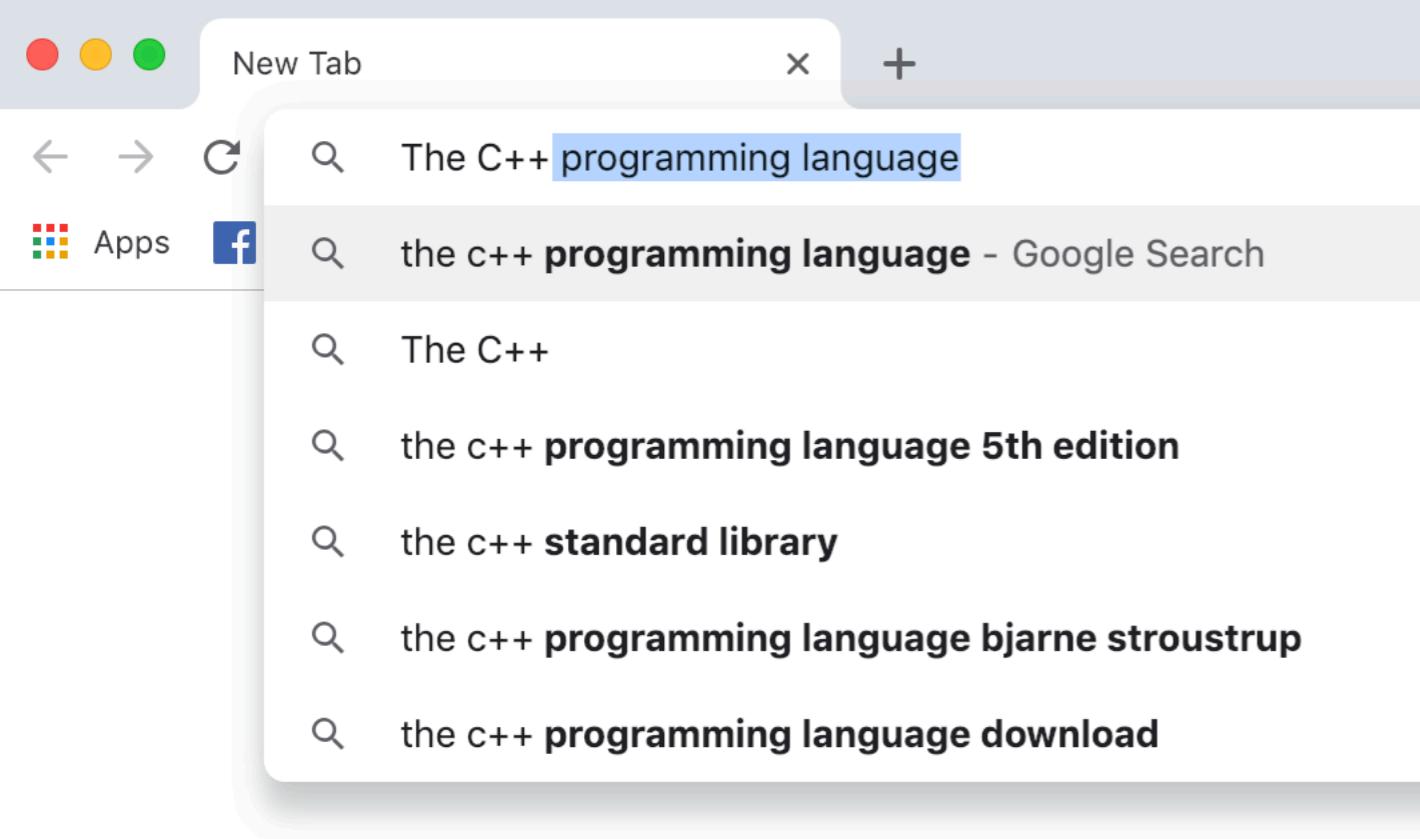
Alistair Moffat



Matthias Petri

?





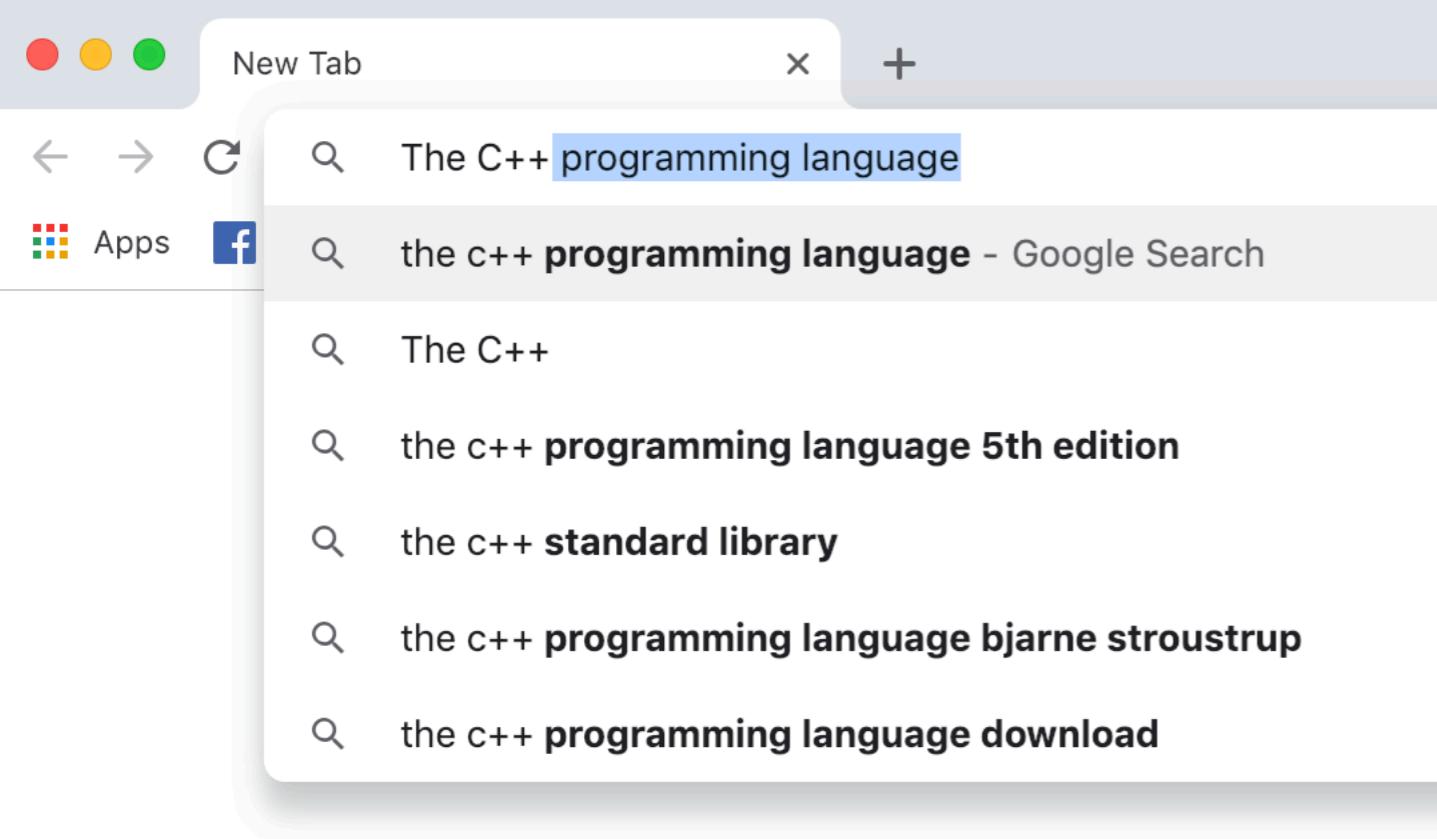
## N-gram lookup



Hey Siri

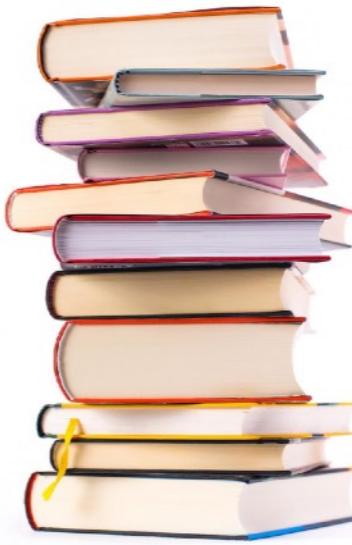


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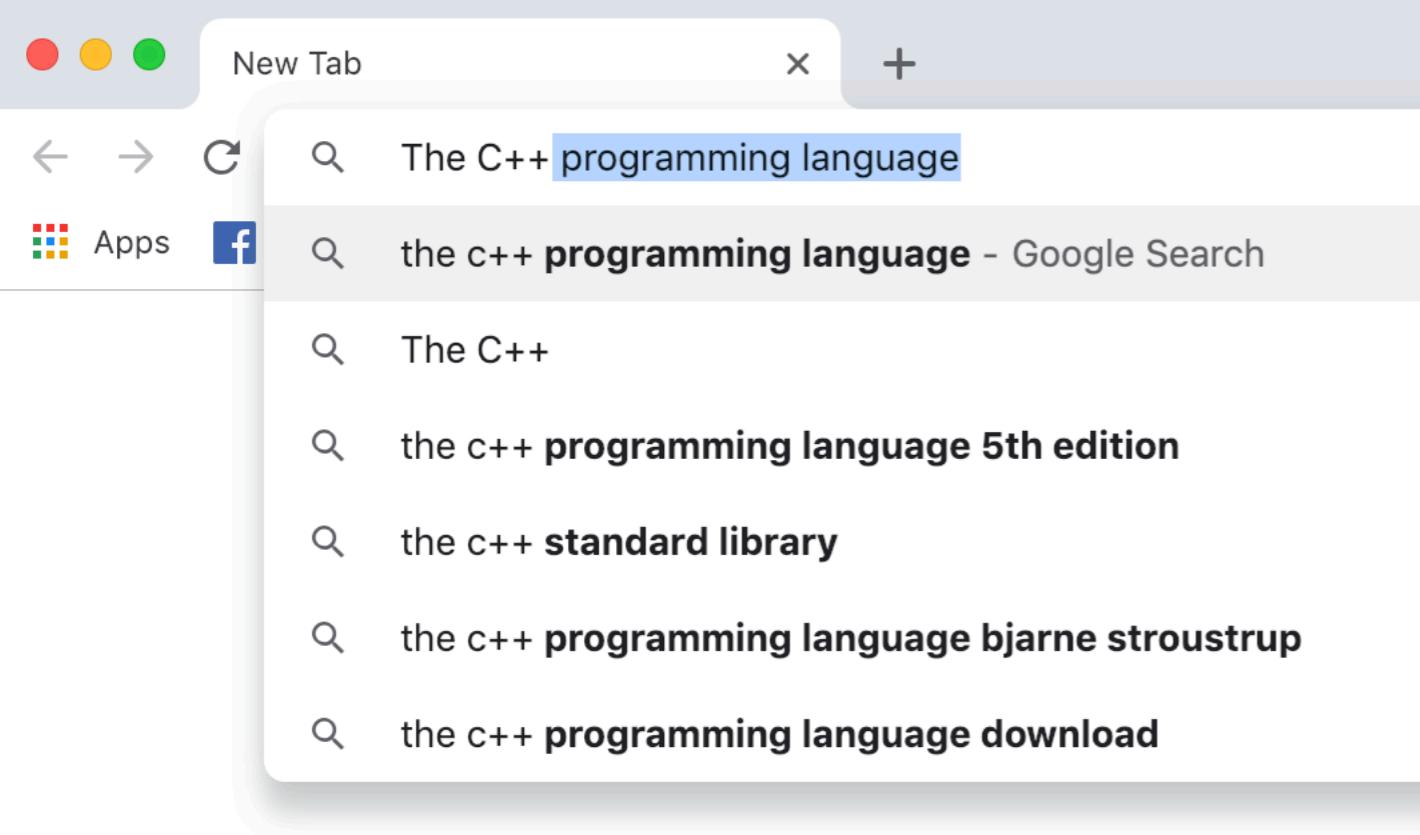
N-gram lookup



Hey Siri

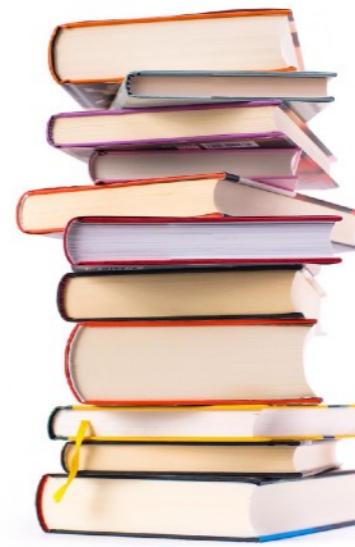


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## N-gram lookup



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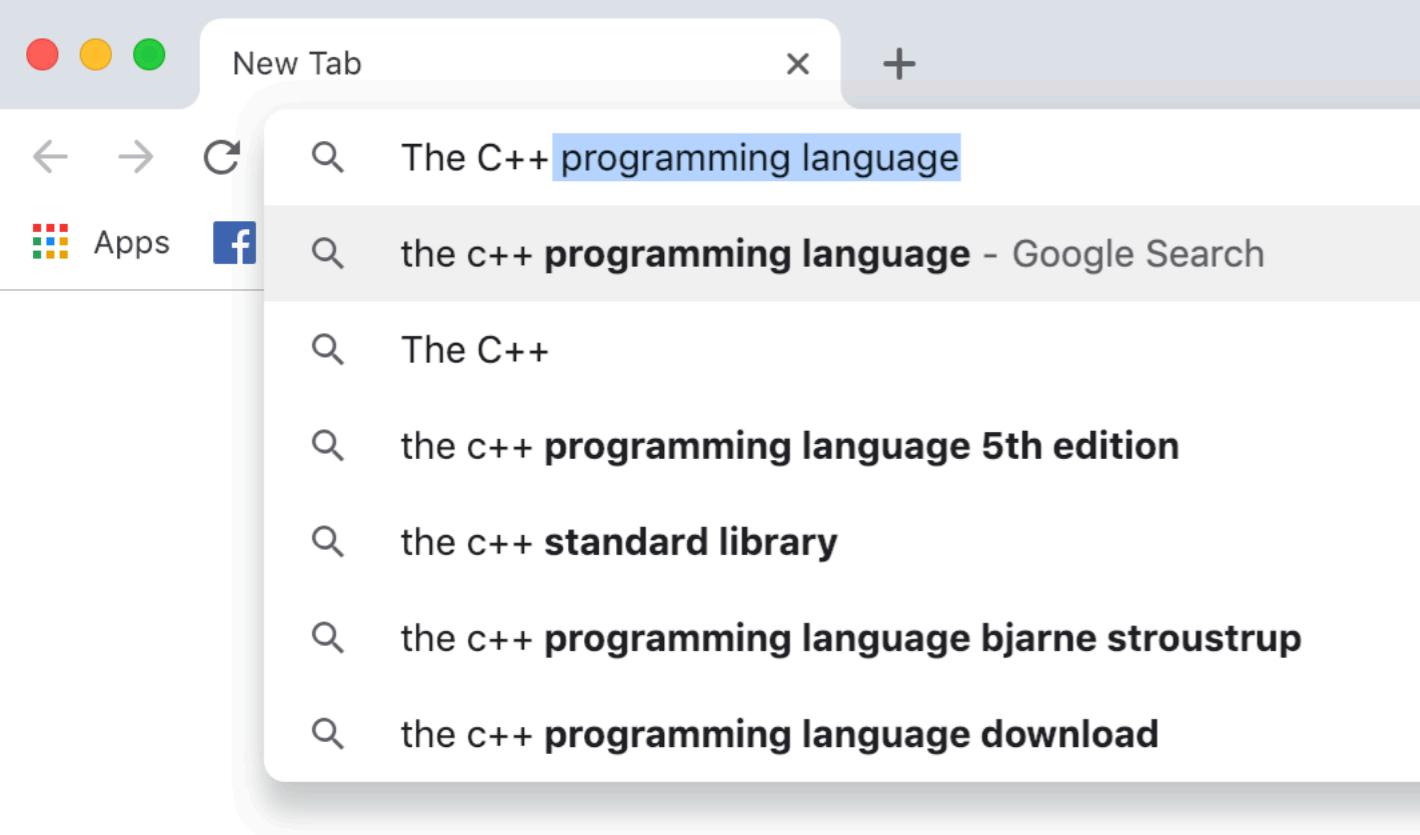
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**ACM SIGIR 17**

**~29GB**

**Indexing?**

1



## N-gram lookup



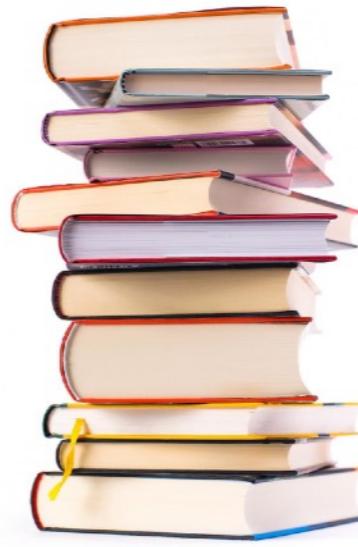
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**Indexing?**

**1**

**ACM TOIS 19**  
(to appear)

**Estimation?**

**2**

**Efficiency to deliver better services by using less resources.**

Impact is far reaching and implies substantial economic gains.

**Do not underestimate the impact of efficient software:  
do not (just) rely on hardware.**

**My resources are publicly available:**

<http://pages.di.unipi.it/pibiri>

<https://github.com/jermp>

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## RDF indexing

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Thanks for your attention,  
time, patience!