## CS 758/858: Algorithms

Algorithms	
This Class	
Sorting	
Complexity	http://ww
	course
	online han
	1 physical si

Prof. Wheeler Ruml TA Steve Wissow

http://www.cs.unh.edu/~ruml/cs758

4 handouts: course info, schedule, slides, asst 1

online handouts: programming, functions

1 physical sign-up laptop (for grades, piazza)

### Algorithms

■ Algorithms Today

Definition

■ Why?

■ The Word

■ The Founder

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# Algorithms

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## **Algorithms Today**

Algorithms
Algorithms Today
Definition
■ Why?
■ The Word
■ The Founder
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web: search, caching, crypto

networking: routing, synchronization, failover machine learning: data mining, recommendation, prediction bioinformatics: alignment, matching, clustering hardware: design, simulation, verification business: allocation, planning, scheduling finance: trading, credit scoring, fraud detection government: bail, sentencing, social scoring Al: robotics, games, language, vision

## Definition

# Algorithms Algorithms Today Definition Why? The Word

■ The Founder

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## Algorithm

- input into output
- precisely defined
- mechanical steps
  - terminates

What might we want to know about it?

# Why?

## Algorithms

- Algorithms Today
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- □ Why?
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- Computer scientist  $\neq$  programmer
  - understand program behavior
  - have confidence in results, performance
  - know when optimality is abandoned
  - solve 'impossible' problems
  - sets you apart (eg, interviewing)
- CPUs aren't getting faster
- Devices are getting smaller
- Software is the differentiator

'Software is eating the world' — Marc Andreessen, 2011

Everything is computation

## The Word: Abū 'Abdallāh Muḥammad ibn Mūsā al-Khwārizmī

#### Algorithms

- Algorithms Today
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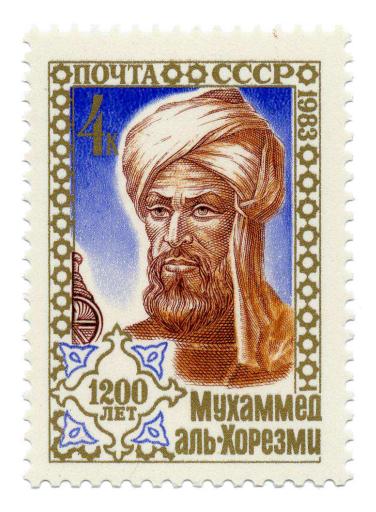
Sorting

Complexity

780-850 AD
Born in Uzbekistan, worked in Baghdad.
Solution of linear and quadratic equations.
Founder of algebra.
Popularized arabic numerals, decimal positional numbers
→ algorism (manipulating digits)

 $\rightarrow$  algorithm.

The Compendious Book on Calculation by Completion and Balancing, 830.



## The Founder: Donald E. Knuth

Algorithms

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The Founder

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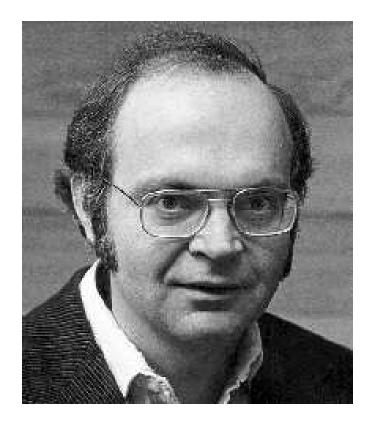
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Complexity

invented algorithm analysis, *O The Art of Computer Programming*, vol. 1, 1968

developed T<sub>E</sub>X, literate programming

famous results, students published in MAD magazine



#### Algorithms

## This Class

- Relations
- Topics
- Course Mechanics

Sorting

Complexity

# **This Class**

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## Relations

Algorithms
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Relations
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Course Mechanics
Sorting

Complexity

requires 531/659 (proofs), 515 (data structures), 420 (C) some intentional overlap! beware imposter syndrome problems intentionally unpredigested central (required for BS CS and BS DS) same content both semesters

continuous improvement!

## **Topics**

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Relations
 Topics

Course Mechanics

## 'Greatest Hits'

- 1. data structures: trees, tries, hashing
  - 2. algorithms: divide-and-conquer, dynamic programming, greedy, graphs
  - 3. correctness: invariants
  - 4. complexity: time and space
  - 5. NP-completeness: reductions
  - Not including
  - 1. (much) computability
  - 2. (many) randomized algorithms
  - 3. parallel algorithms
  - 4. distributed algorithms
  - 5. numerical algorithms, eg: crypto, linear algebra
  - 6. geometric algorithms
  - 7. on-line or 'run forever' algorithms
  - 8. fancy analysis

## **Course Mechanics**

### Algorithms

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- Relations
- Topics
- Course Mechanics

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- $\blacksquare names \rightarrow faces$
- sign up sheet
- General information
  - contact, books, C, due dates, collaboration, piazza.com
- Schedule
  - wildcard slot
- Expectations
  - ♦ 50/4=12.5; 50/3=16.7
  - ◆ 2018: median 12, mean 12.8, stddev 5.5
  - ◆ 2023: median 16, mean 16.1, stddev 5.2
- Feedback is always needed and appreciated.
  - eg, EOLQs. Try coming to my office hours!

Algorithms

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## Sorting

■ Sorting

 $\blacksquare Counting Sort$ 

Correctness

Complexity

# Sorting

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# Sorting

## Algorithms This Class Sorting

- Counting Sort
- Correctness

Complexity

- Bubble Sort
- Selection Sort
- Insertion Sort
- Shell Sort
- Merge Sort
- Heap Sort
- Quick Sort

How to sort one million records?

# Sorting

## Algorithms This Class Sorting

- Sorting
- Counting Sort
- Correctness

Complexity

- Bubble Sort
- Selection Sort
- Insertion Sort
- Shell Sort
- Merge Sort
- Heap Sort
- Quick Sort

How to sort one million records?

How to sort one billion 16-bit integers?

# Sorting

# Algorithms This Class Sorting Sorting

- Counting Sort
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Complexity

- Bubble Sort
- Selection Sort
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- Quick Sort

How to sort one million records?

How to sort one billion 16-bit integers?

How to sort one trillion 4-bit integers?

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# **Counting Sort**

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Sorting

Counting Sort

Correctness

Complexity

For n numbers in the range 0 to k:

- 1. for i from 0 to k
- 2.  $\operatorname{count}[i] \leftarrow 0$
- 3. for each input number x
- 4. increment count[x]
- 5. for i from 0 to k
- 6. do count[i] times
- 7. emit i

# **Counting Sort**

Algorithms

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Sorting

Counting Sort

Correctness

Complexity

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Correctness?

Complexity?

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Correctness

Complexity

property 1: output is in sorted order proof sketch: output loop increments i, never decrements

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■ Counting Sort

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property 1: output is in sorted order proof sketch: output loop increments i, never decrements

property 2: output contains same numbers as input invariant:

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Correctness

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property 1: output is in sorted order proof sketch: output loop increments i, never decrements

property 2: output contains same numbers as input invariant: for each value,

remaining input + sum of counts = total proof sketch:

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property 1: output is in sorted order proof sketch: output loop increments i, never decrements

property 2: output contains same numbers as input invariant: for each value,

remaining input + sum of counts = total
proof sketch:
initialized/established: before line 3
maintained: through lines 3–4
at termination: no remaining input by line 5
 each number printed count times
 therefore, output has same numbers as input

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## Complexity

 $\blacksquare$  Counting Sort

■ Complexity

■ Counting Sort

Order Notation

■ O()

Examples

And Friends

Asymptotics

EOLQs

# Complexity

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# **Counting Sort**

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- Counting Sort
- Complexity
- Counting Sort
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- EOLQs

For n numbers in the range 0 to k:

- 1. for i from 0 to k
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- 5. for  $i \mbox{ from 0 to } k$
- 6. do count[i] times
- 7. emit i

Correctness? Yes.

Complexity?

## Complexity

Algorithms

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■ Counting Sort

Complexity

■ Counting Sort

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RAM model: no cache order of growth worst-case

[ try with previous slide ]

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## **Counting Sort**

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Counting Sort

Order Notation

■ O()

Examples

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Asymptotics

EOLQs

For n numbers in the range 0 to k:

1. for x from 0 to k2. count $[x] \leftarrow 0$ 3. for each input number x4. increment count[x]5. for x from 0 to k6. do count[x] times 7. emit x

O(k) times around loop iterates O(n) times total O(1) each time

O(k)

O(n)

 $O(k+n+k+n) = O(2n+2k) = O(n+k) \neq O(n \lg n)$ 

## **Order Notation**

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- Counting Sort
- Complexity
- Counting Sort
- Order Notation
- O()
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- And Friends
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ignore constant factors ignore 'start-up costs' upper bound

## **Order Notation**

Algorithms

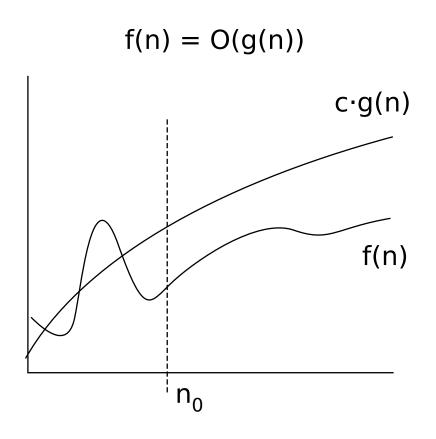
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ignore constant factors ignore 'start-up costs' upper bound



eg, running time is  $O(n\log n)$ 

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# <u>O()</u>

Algorithms

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EOLQs

 $O(g(n)) = \{f(n) : \text{there exist positive constants } c, n_0$ such that  $f(n) \le cg(n)$  for all  $n \ge n_o\}$ 

We can upper-bound (the tail of) f by scaling up g.

Note non-transitive use of =. Pronounced 'is'.

1. 
$$0.002x^2 - 35,456x + 2^{80}$$
  
2.  $O(n^2)$  vs  $O(n^3)$   
3.  $O(2^n)$  vs  $O(3^n)$   
4.  $O(2^n)$  vs  $O(2^{n+2})$  vs  $O(2^{2n})$  vs  $O(n^n)$   
"What is  $n$ ?"

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Eg:

## **Examples**

Algorithms

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is 
$$n^3 = O(n^2)$$
  
 $0.2x^2 - 456x + 2^{20}$   
 $10n^2 + 5n$   
 $O(n^2)$  vs  $O(n^3)$ 

## **And Friends**

Algorithms

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Counting Sort

Complexity

■ Counting Sort

Order Notation

■ O()

Examples

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Asymptotics

EOLQs

 $\begin{array}{ll} \mbox{Upper bound ('order of'):}\\ O(g(n)) = & \{f(n): \mbox{there exist positive constants } c, n_0 \\ & \mbox{ such that } f(n) \leq cg(n) \mbox{ for all } n \geq n_o \} \end{array}$ 

Lower bound:  $\Omega(g(n)) = \{f(n) : \text{there exist positive constants } c, n_0 \\ \text{such that } cg(n) \le f(n) \text{ for all } n \ge n_o \}$ 

Tight bound:  $\Theta(g(n)) = \begin{cases} f(n) : \text{there exist positive constants } c_1, c_2, n_0 \\ \text{such that } c_1g(n) \le f(n) \le c_2g(n) \text{ for all } n \ge n_o \end{cases}$ 

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## Asymptotics

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Upper bound ('dominated by'):  

$$o(g(n)) = \{f(n) : \lim_{n \to \infty} \frac{f(n)}{g(n)} = 0\}$$

Lower bound ('dominates'):  

$$\omega(g(n)) = \{f(n) : \lim_{n \to \infty} \frac{f(n)}{g(n)} = \infty\}$$

# **EOLQ**s

## Algorithms

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- What's still confusing?
- What question didn't you get to ask today?
- What would you like to hear more about?

Please write down your most pressing question about algorithms and put it in the box on your way out.

Thanks!