

CS 226 Lecture 1: Introduction

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Intermediate-level survey course

- prerequisite: COS 126
- programming/problem solving

Algorithm: method for solving a problem

Data Structure: a way to store information

Efficient algorithms use good data structures

Why study algorithms?

Using a computer?

- want it to go faster
- want it to process more data
- want to do something that would otherwise be impossible

Technology improves things by a constant factor

...but might be costly

Good algorithm design can do much better

...and might be cheap

Supercomputer cannot rescue a bad algorithm

Algorithms as a field of study

- old enough that basics are known
- new enough that new discoveries arise
- burgeoning application areas
- philosophical implications

Analysis of algorithms

Compare algorithms by comparing estimated costs

N: size of the input

Typical running times (within constant factor)

- 1
- $\log N$
- N
- $N \log N$
- N^2
- 2^N

Worst Case (guarantee)

Average Case (prediction)

Other functions sometimes arise

- \sqrt{N}
- $\log \log N$ [$\log(\log N)$]
- $\log^* N$ number of logs until 1 reached

Sample problem: Online connectivity

Input:

- sequence of pairs of integers (p, q)
- p "is connected to" q

Output:

- nothing if p and q are already connected
- (p, q) otherwise

Assume "is connected to" is commutative and transitive

- if p is connected to q then q is connected to p
- if (also) q is connected to r then p is connected to r

Output lists previously unknown connections

Example of application

- integers represent computers
- pairs represent network connections
- can p and q communicate through network?

Online connectivity example

in	out	evidence
3 4	3 4	
4 9	4 9	
8 0	8 0	
2 3	2 3	
5 6	5 6	
2 9		(2--3--4--9)
5 9	5 9	
7 3	7 3	
4 8	4 8	
5 6		(5--6)
0 2		(2--3--4--8--0)
6 1	6 1	

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UNION and FIND

Disconnected piece may be hard to spot
...particularly for a computer!

Number of nodes and edges can be huge

- Internet
- computer chip

Need to design data structure and algorithms

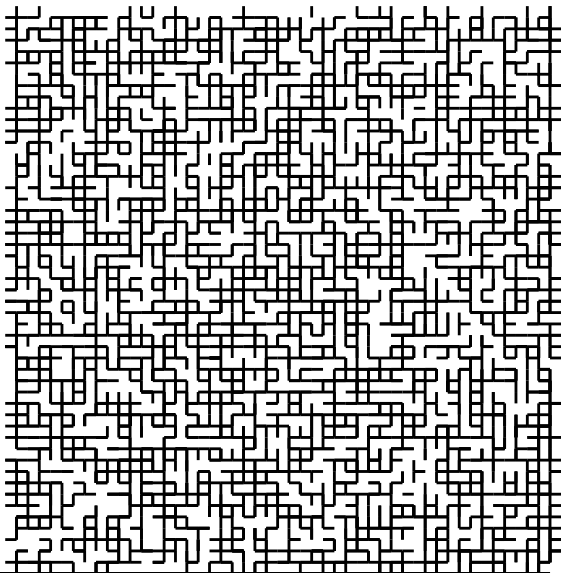
Data structure to record connectivity information

Algorithm to use it to test connectivity (FIND)

Algorithm to update data structure (UNION)

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Network connectivity example



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Quick-find algorithm

Maintain array with names for components

- if i and j are connected,
- $id[i]$ and $id[j]$ are the same

To maintain this property for p - q connection

- ignore if $id[p] = id[q]$
- change all entries with p 's id to q 's id

QUICK-FIND name due to constant-time test
to find out if edge makes a new connection
SLOW-UNION?

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Quick-find implementation

```
main(int argc, char *argv[])
{ int i, p, q, t, N = atoi(argv[1]);
  int *id = malloc(N*sizeof(int));
  for (i = 0; i < N; i++) id[i] = i;
  while (scanf("%d %d\n", &p, &q) != EOF)
  {
    if (id[p] == id[q]) continue;
    t = id[p];
    for (i = 0; i < N; i++)
      if (id[i] == t) id[i] = id[q];
    printf(" %d %d\n", p, q);
  }
}
```

Problem size and computation time

Rough standard for 2000

- 10^9 operations per second
- 10^9 words of memory
- touch each word in approximately 1 second (roughly unchanged since at least 1950)

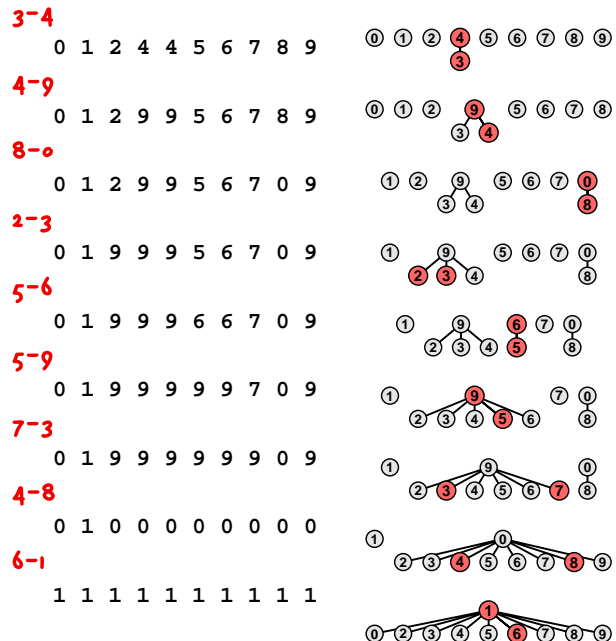
Ex: huge problem for quick-find

- 10^{10} edges connecting 10^9 nodes (edges need not fit in memory)
- Quick-find might take 10^{20} operations (relabel each node (10 ops) for each edge)
- 3000 years of computer time (too much)

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Quick-find example



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Quadratic running time

Quick estimate of running time

- number of edges and nodes both $O(N)$
- running time of quick-find $O(N^2)$

$$(10N)^2/10 = 10N^2$$

Gap grows as scale increases

new computer may be 10 times faster
 ...but has 10 times as much memory
 so (with quadratic algorithm)
 ...takes 10 times as long to finish!

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Quick-union algorithm

Maintain array with names for components

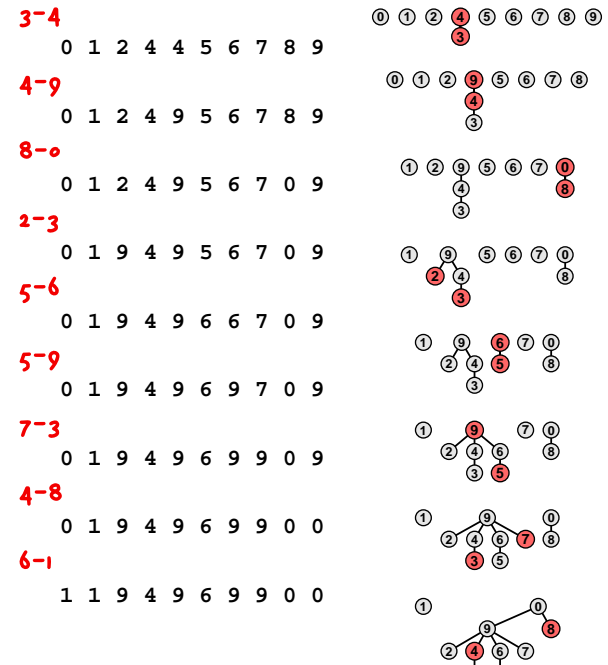
- if i and j are connected,
- $(id[i])^*$ and $(id[j])^*$ are the same
- where $(id[i])^* = id[id[id[...id[i]]]]$
(go until it doesn't change)

To maintain this property for p - q connection

- ignore if $(id[p])^* = (id[q])^*$
- set $id[i]$ to j

QUICK-UNION: constant-time for new connection
SLOW-FIND?

Quick-union example



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Quick-union implementation

```
main(int argc, char *argv[])
{
    int i, j, p, q, t, N = atoi(argv[1]);
    int *id = malloc(N*sizeof(int));
    for (i = 0; i < N; i++) id[i] = i;
    while (scanf("%d %d\n", &p, &q) != EOF)
    {
        i = p; j = q;
        while (i != id[i]) i = id[i];
        while (j != id[j]) j = id[j];
        if (i == j) continue;
        id[i] = j;
    }
}
```

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Weighted quick-union algorithm

Quick-find defect:

- UNION could be too expensive
- trees are flat, but too hard to keep them flat

Quick-union defect:

- FIND could be too expensive
- trees could get tall

Modify quick-union to avoid tall trees

- keep track of size of each component
- balance by linking small one below large one

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Weighted quick-union implementation

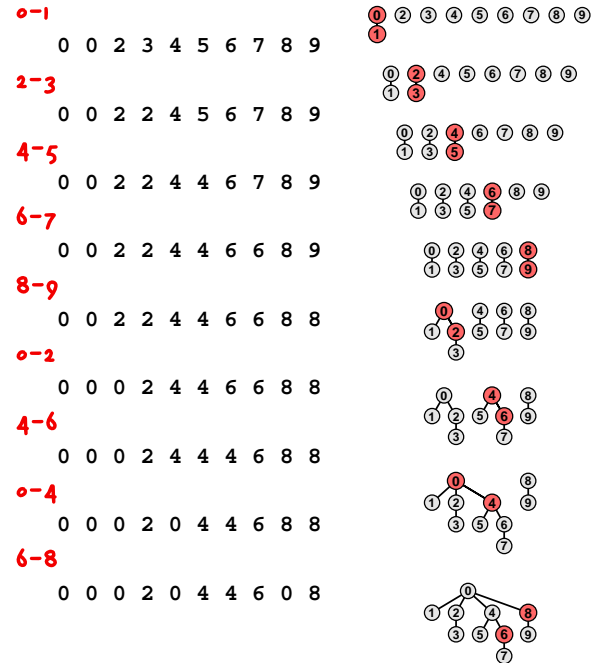
```

for (i = 0; i < N; i++) id[i] = i;
for (i = 0; i < N; i++) sz[i] = 1;
while (scanf("%d %d\n", &p, &q) != EOF)
{
    for (i = p; i != id[i]; i = id[i]) ;
    for (j = q; j != id[j]; j = id[j]) ;
    if (i == j) continue;
    if (sz[i] < sz[j])
        { id[i] = j; sz[j] += sz[i]; }
    else
        { id[j] = i; sz[i] += sz[j]; }
    printf(" %d %d\n", p, q);
}

```

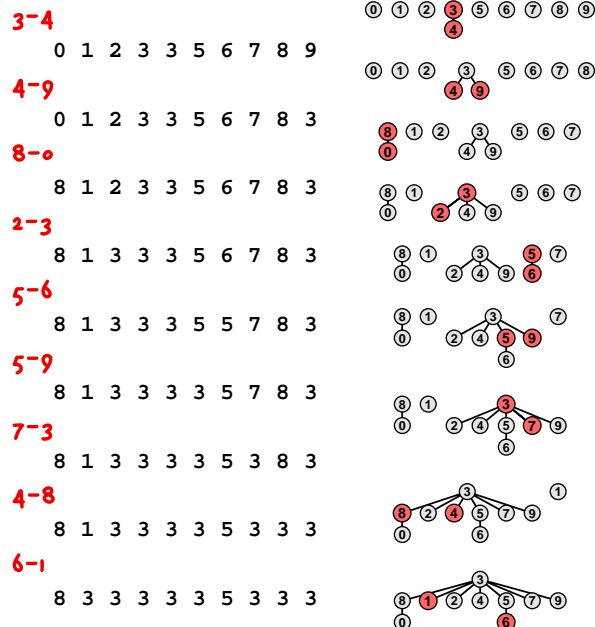
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Weighted quick-union worst case



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Weighted quick-union example



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Weighted quick union analysis

Is performance improved?

To answer this question, need to:

- run empirical studies
- analyze the algorithm

Good news:

- Worst case is $O(\lg N)$ steps per edge

Better news:

- Average case is $O(1)$ steps per edge

Ex: huge practical problem

- 10^{10} edges connecting 10^9 nodes
- reduces time from 3000 years to 1 minute

Supercomputer wouldn't help much

Good algorithm makes solution possible

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Path compression for weighted quick-union

Stop at guaranteed acceptable performance?
 ...not hard to improve alg further

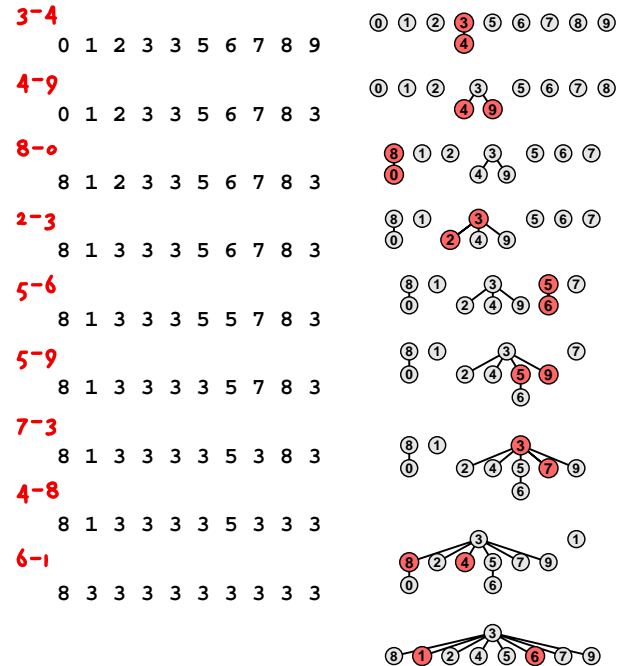
Modify weighted quick-union to compress tree
 • make every node hit point to the new root

No reason not to!

In practice, keeps trees almost completely flat
 Same effect as quick-find, without the work

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Path compression example



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Path compression implementation

```

for (i = 0; i < N; i++) id[i] = i;
for (i = 0; i < N; i++) sz[i] = 1;
while (scanf("%d %d\n", &p, &q) != EOF)
{
    for (i = p; i != id[i]; i = id[i]) ;
    for (j = q; j != id[j]; j = id[j]) ;
    if (i == j) continue;
    if (sz[i] < sz[j])
        { id[i] = j; sz[j] += sz[i]; t = j; }
    else
        { id[j] = i; sz[i] += sz[j]; t = i; }
    for (i = p; i != id[i]; i = id[i])
        id[i] = t;
    for (j = q; j != id[j]; j = id[j])
        id[j] = t;
    printf(" %d %d\n", p, q);
}
    
```

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Path compression analysis

THM: Worst-case tree height is $O(\lg^* N)$
Proof: Extremely difficult
 ...but the *algorithm* is still simple!

Note: $\lg^* N$ is constant in this world

.	N	$\lg^* N$
.	2	1
.	4	2
.	16	3
.	65536	4
.	any practical value	5

OPTIMAL algorithm

• cost within a constant factor of cost of gathering data
 theory: QFWPC is not optimal
 practice: it is (in the real world)

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Union-find summary

Worst-case cost per edge is proportional to

quick-find	N
quick-union	N
weighted	$\lg N$
path compression	5

Online algorithm: can solve problem while collecting the data, for "free"

Set-merging abstraction

- FIND: is A in the same set as B?
- UNION: merge A's set and B's set

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Lessons

A "trivial" algorithm can be useful
...and nontrivial to study

- start with simple algorithm
- don't use simple algorithm for large problems
- can't use simple algorithm for huge problems
- higher level of abstraction (tree) is helpful
- fast performance on real data OK, but
- strive for worst-case performance guarantees
- identify fundamental abstraction

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SORTING

- Elementary algorithms, Shellsort
- Quicksort
- Mergesort
- Priority queues
- Radix sorts

Sort an array that fills memory

Make the union of M spelling dictionaries

Priority queue ADT

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SEARCHING

- Tree searching
- Hashing
- Trie searching

Oxford English Dictionary

Internet search engines

DNA subsequence library

Dictionary ADT for other algorithms

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STRINGS

- String searching
- Pattern matching
- File compression

file systems, audio and video

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GRAPH ALGORITHMS

- Properties of graphs
- Searching in graphs
- Advanced graph algorithms

Connectivity
matching (e. g. students to jobs)
networks

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GEOMETRIC ALGORITHMS

- Elementary algorithms
- Convex hull
- Multidimensional searching

N-body simulation
World models for games and movies
CAD

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OTHER TOPICS

- Mathematical algorithms
- Dynamic programming
- Parallel algorithms
- Randomized algorithms
- Intractable problems

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COURSE MATERIALS

Text

- Algorithms, 3rd edition, in C
Parts 1-4 (126 text)
Part 5 (graph algorithms)
- Strings and Geometry sections of old book
copies available after midterm

Lecture notes

- online

Online course information on homepage

READ HANDOUT ONE

READ ONLINE INFORMATION

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COURSEWORK

Programming Assignments

- weekly, eleven in all
- electronic submission
programs due Thursdays 11:59PM
writeups due Fridays 4:59PM
- first one due NEXT Thursday

Problem Sets

- weekly, nine in all
- due in precept
- first one due NEXT Monday

Exams

- closed book w/ cheat sheet
- midterm in class Wednesday before break
- final at scheduled time

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