

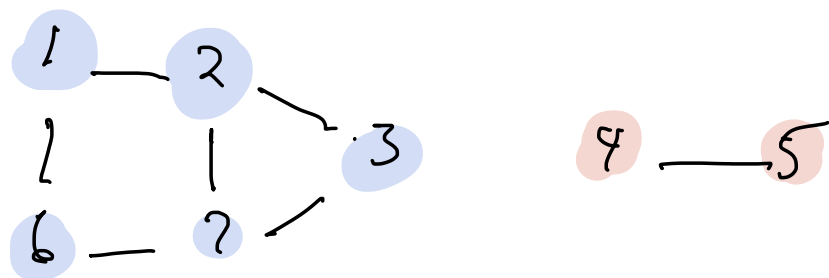
# Data structures Packet 4

## Depth-first search

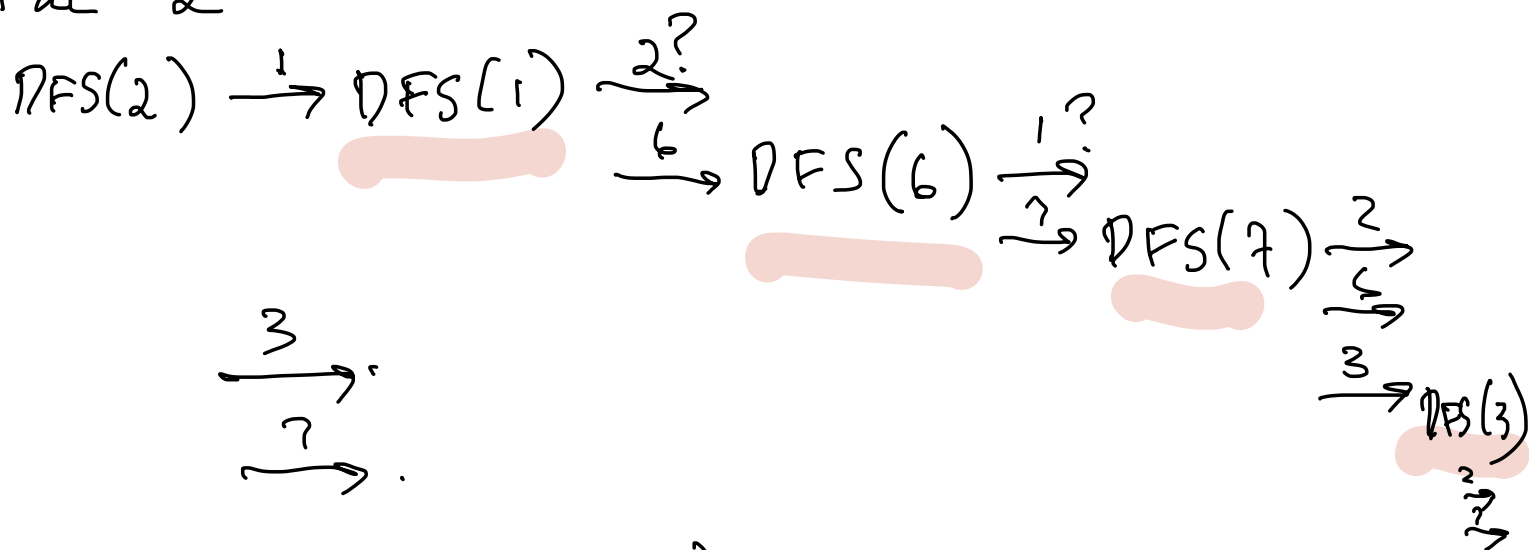


```

void DFS(vertex here) {
    // assume visited[*] = false
    visited[here] = true;
    foreach neighbor (successors(here))
        if (!visited[neighbor]) DFS(neighbor);
}
    
```



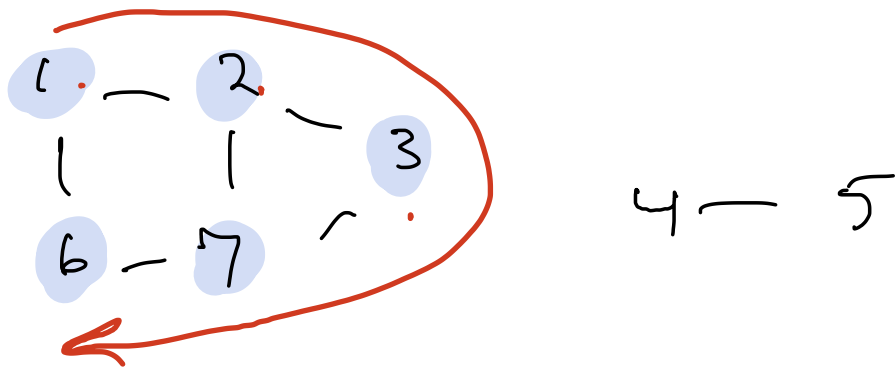
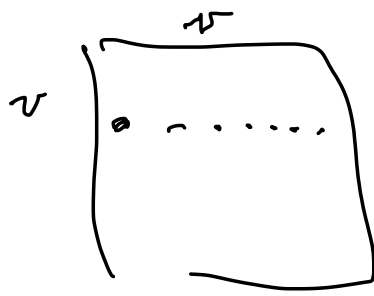
Start at 2



Adjacency list:  $\mathcal{O}(v' + e')$   
 ↑  
 vertices in connected component

Adjacency matrix

$$O(v \cdot v)$$

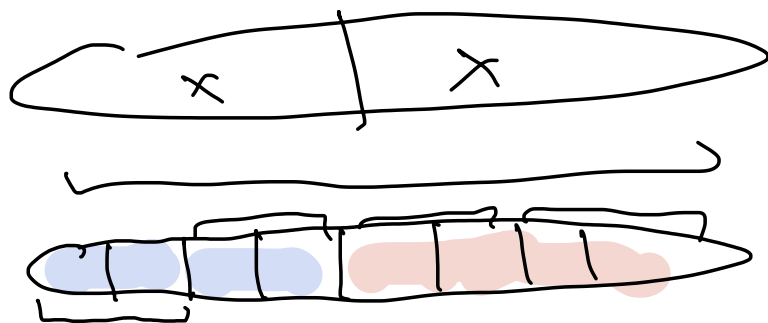


```
void DFS(vertex here) { // assume as before
  workStack = makeEmptyStack();
  push(workStack, here);
  while (!emptyStack(workStack)) {
    place = pop(workStack);
    if (visited[place]) continue;
    visited[place] = true;
    foreach neighbor (successors(place))
      if (!visited[neighbor])
        push(workStack, neighbor);
  } // while work to do
} // DFS()
```

---

Aside: iteration vs. recursion

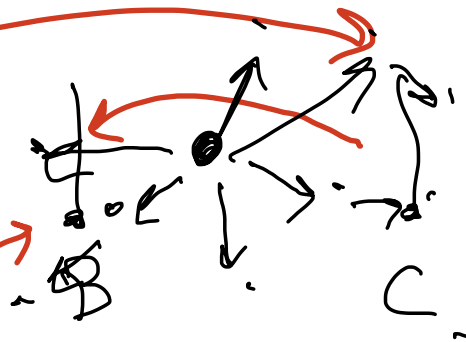
mergeSort



# Breadth First Search.

Applications

1) find how people are related.

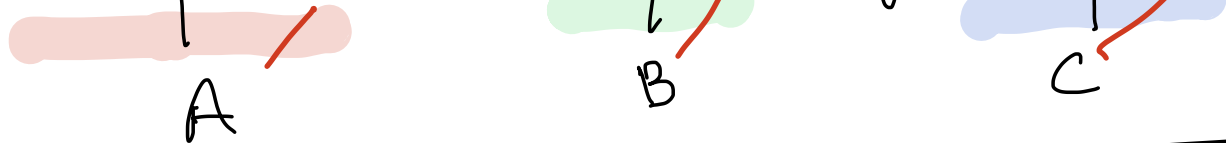


identified route through city streets.

every time ~~find the shortest~~ <sup>right</sup> way for plane travel.

unweighted graph (all edges are identical)

method: place unfinished work in a queue.



---

To tell if a graph is connected:

Do DFS from any vertex.

if any vertex is still unvisited, not connected.

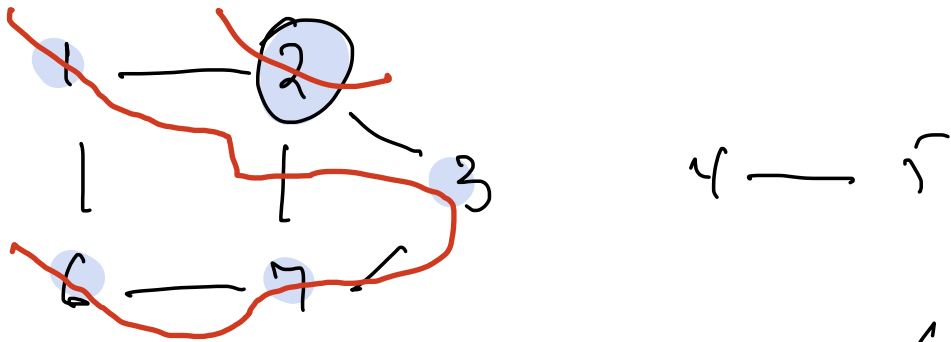
otherwise: connected.

---

```
void BFS(vertex start) { // assume as before
    workQueue = makeQueue(); // Queue of vertices
    visited[start] = true;
    insertBack(workQueue, start);
    while (!emptyQueue(workQueue)) {
        place = deleteFromFront(workQueue);
        foreach neighbor (successors(place)) {
            if (!visited[neighbor]) {
                visited[neighbor] = true;
                insertBack(workQueue, neighbor);
            }
        }
    }
}
```

} // not yet visited  
 } // each neighbor  
 } // still work to do

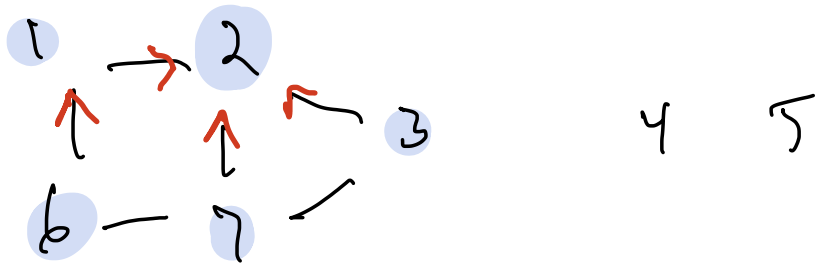
} // BFS()



queue: ~~2~~ ~~3~~ 7 ~~6~~

### Enhancements to BFS

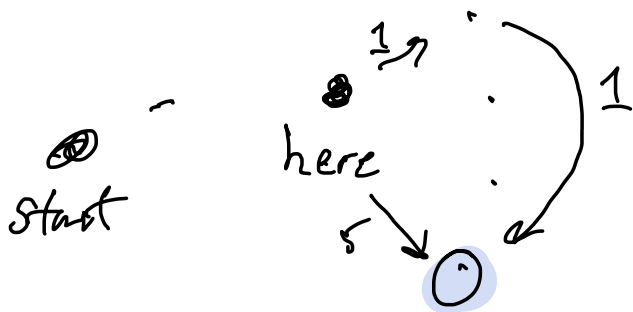
① to store path back to start:



② weighted edges: find closer vertices first.

↑ distance

instead of a queue, use a priority queue (heap)  
(top-light)



# BFS for weighted graph

BFS (vertex start) {

workHeap = makeHeap(); // top-light

insertHeap(start, 0)

while (!emptyHeap(workHeap)) {

(place, distance) = delete(workHeap);

visited[place] = (distance);

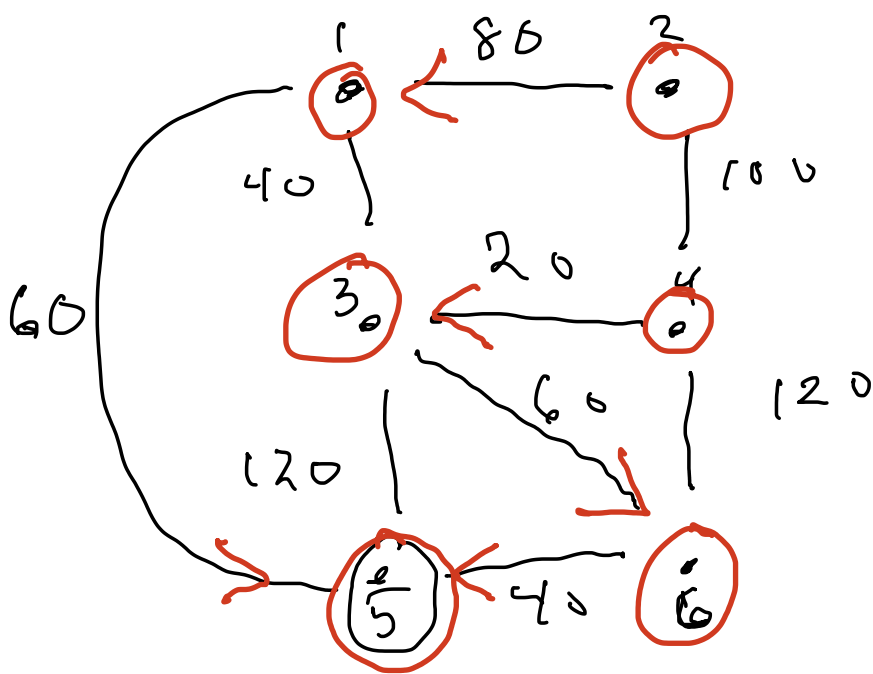
foreach neighbor (... ) {

insertHeap(workHeap, neighbor, distance + edge weight)

}

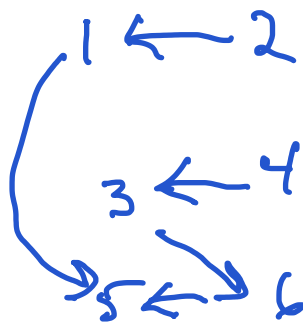
}

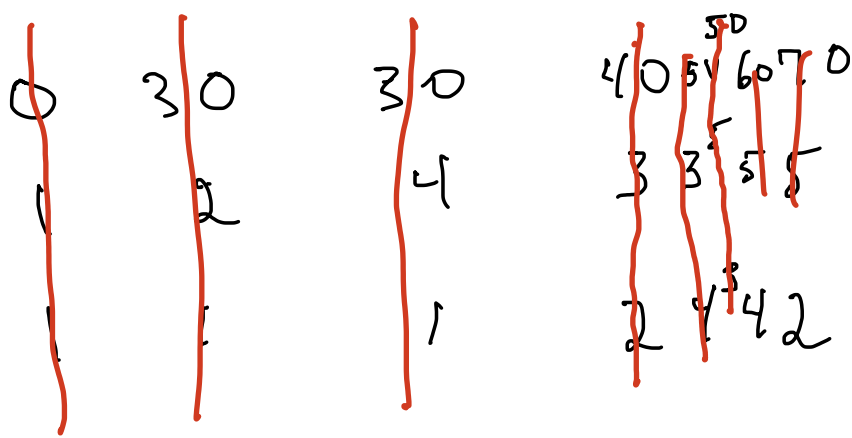
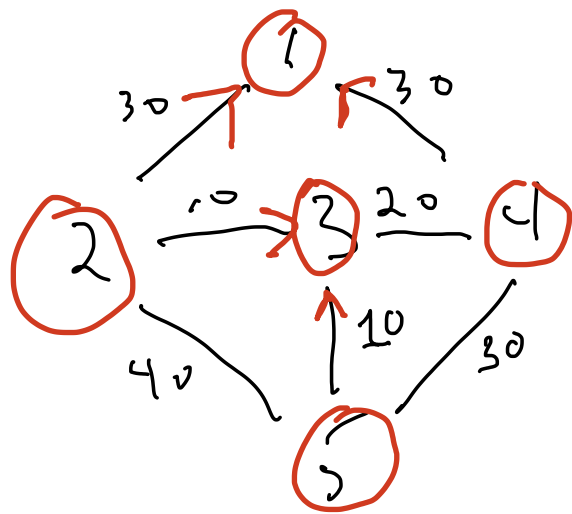
}



Heap

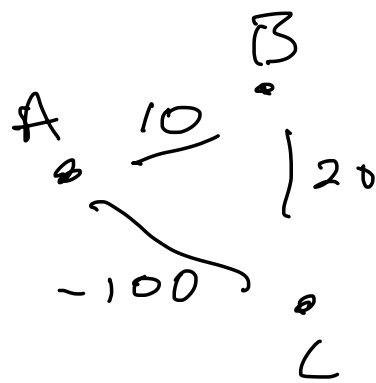
dist.	0	40	60	100	120	220
who	5	6	3	3	4	4
pred.	5	5	6	3	3	6





negative weights  
breaks the algorithm  
introduces  $\infty$  cycles

therefore: renormalize to  
positive weights by adding to  
every weight.

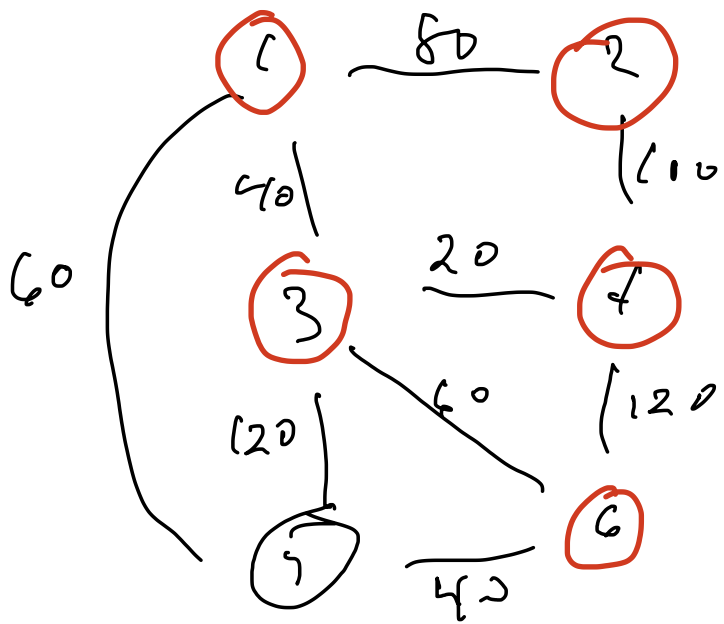


Dijkstra's algorithm to find all shortest paths  
from a given vertex in a weighted undirected  
graph.

Rule: among all vertices that can extend a  
shortest path we have, choose one that  
results in shortest path.

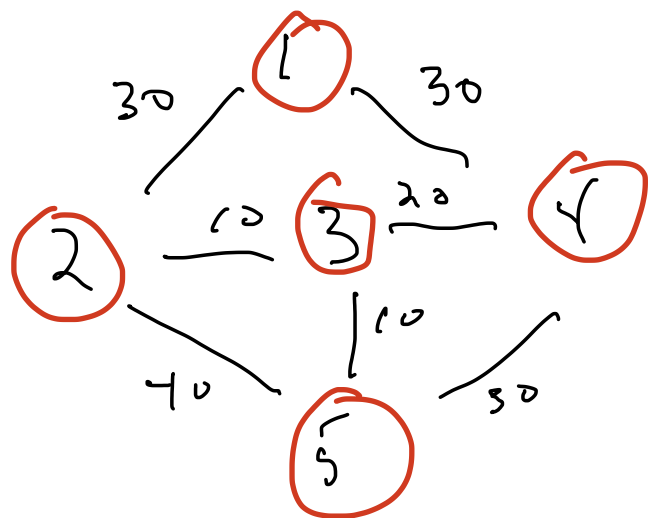
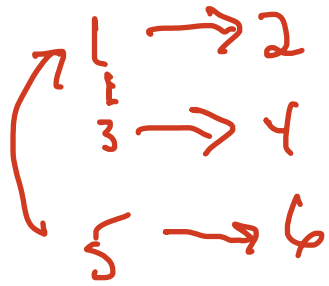
Ties: going to same vertex, choose either.  
going to different vertices, choose both.

"greedy" algorithm: at each step, improve the solution  
in the way that looks best.

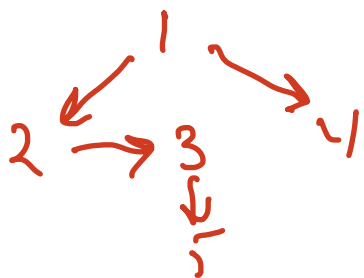


path	length
5	0 ←
5 1	60
5 3	120
5 6	40 ←
5 1	60 ←
5 3	120
5 6 3	100
5 6 4	160
5 3	<del>120</del>
5 1 2	140
5 1 3	100 ←
5 6 3	<del>100</del>
5 6 4	160

5 1 2	140 ←
5 1 3 4	120 ←
<del>5 6 4</del>	<del>160</del>
5 1 3 4 2	220



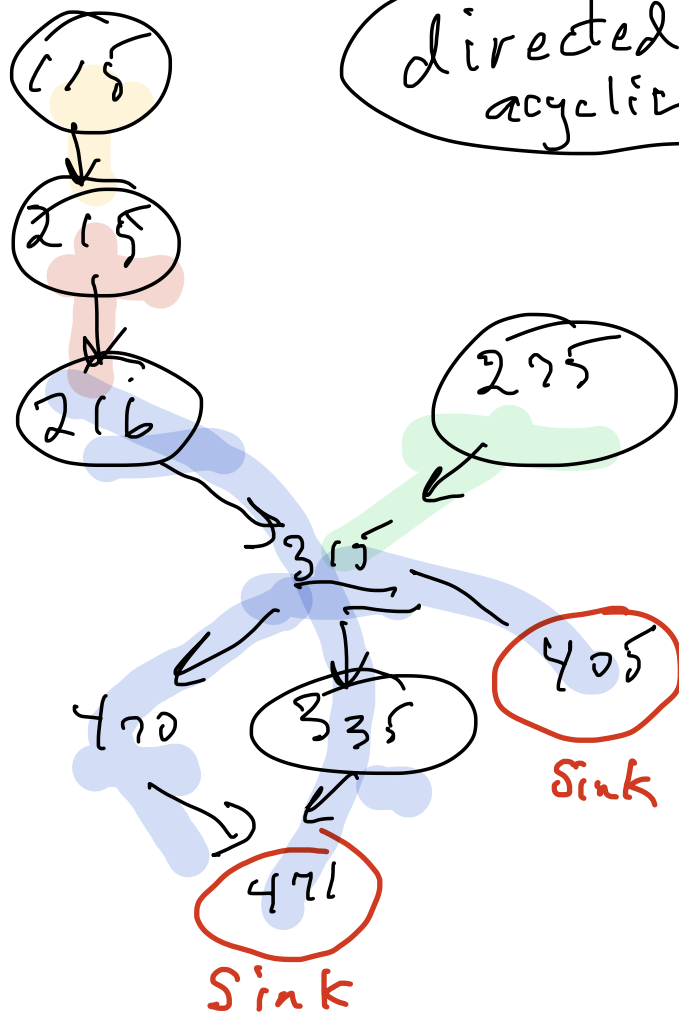
1	0 ←
1 2	30 ←
1 4	30 ←
1 2 3	40 ←
1 2 5	70
<del>1 4 3</del>	<del>50</del>
1 4 5	60
1 2 3 5	50 ←



# Topological Sort

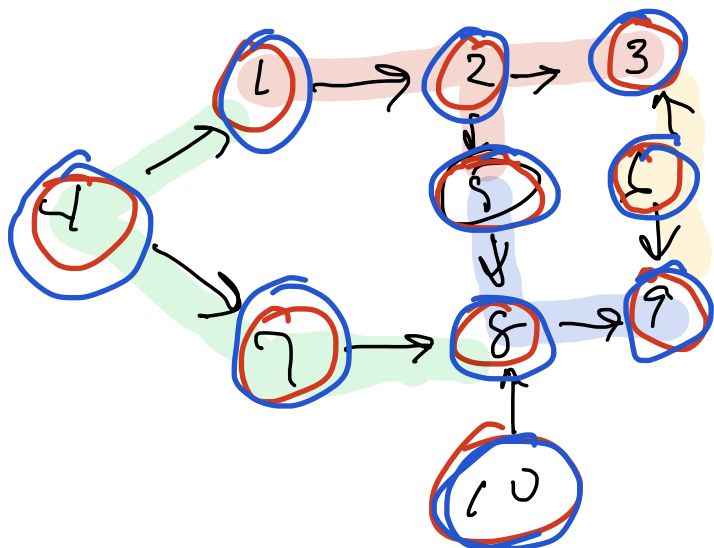
directed graph  
acyclic

valid sequence.

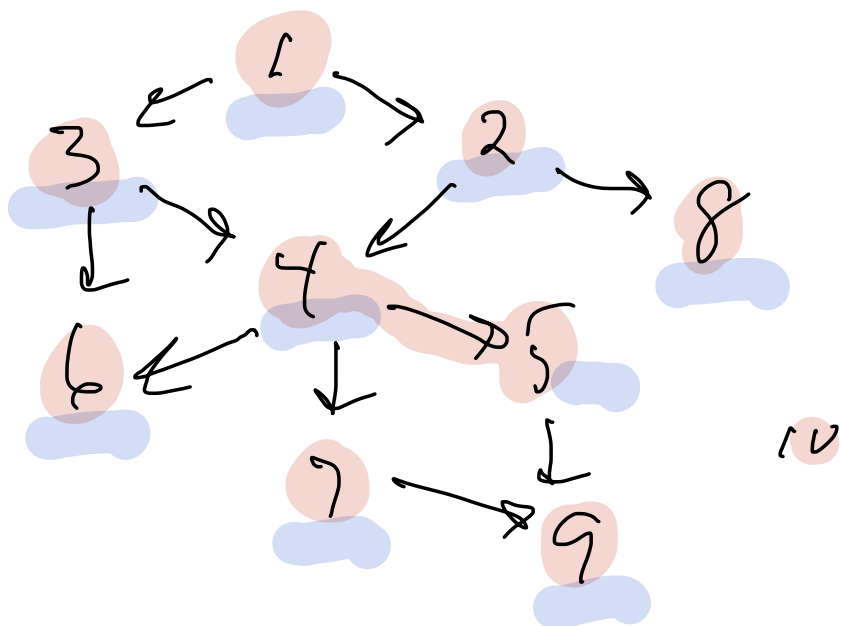


115 275 215 216 315  
405 335 470 471

115 275 215  
216 405 470 335 471  
315



10 6 4 7 1 2 3 5 8 9

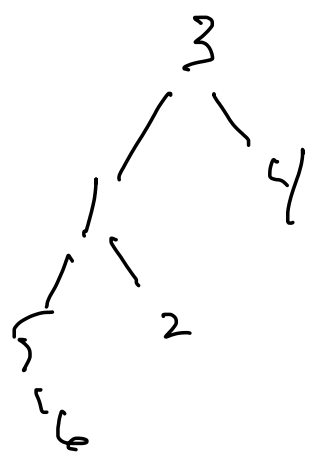
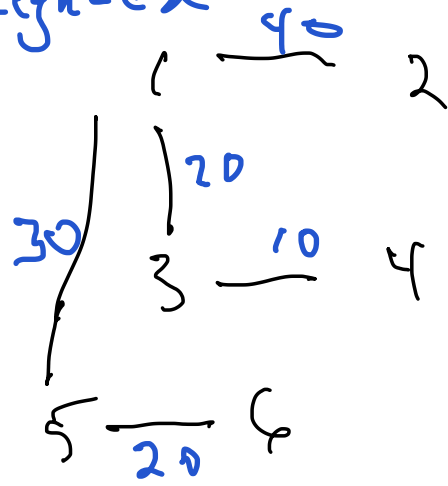
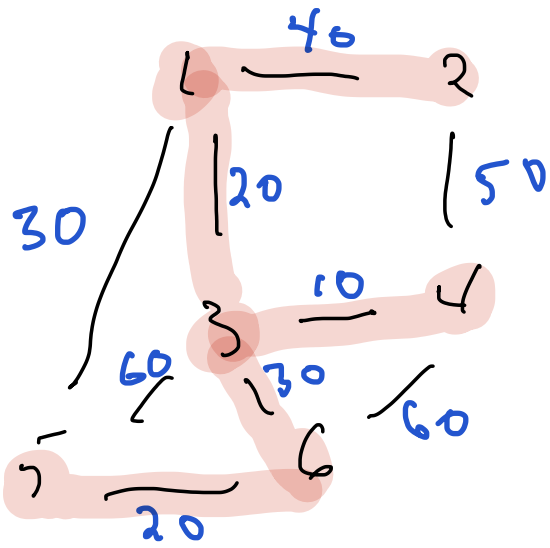


1 3 2 8 4 6 7 5 9



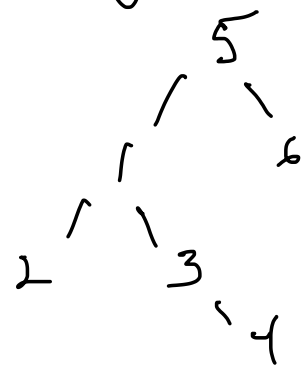
# Spanning trees

Connected, undirected graphs.  
weighted



Spanning tree. Connected, acyclic, all vertices

minimum-weight



## Prim's algorithm

(add vertices)

tree = {a} where a is any vertex

do v-1 times:

tree  $\cup$  = {b} where b is the closest external vertex.

## Implementation.

Heap (top-light) of all external vertices, using distance to current tree as the value for sorting.

Also store which vertex (edge) has that weight.

Initially: {a} = tree

heap = {neighbors of a, weights}  $\cup$  {other vertices,  $\infty$ }

Loop: extract the first element from heap.

for each of its neighbors,  
recalculate entry in heap

remove from heap (if new distance is better)

fix the weight, edge  
put back in heap.

Complexity:

$$\Theta(n + (\log v)e)$$

for each vertex

readjusting external vertices.

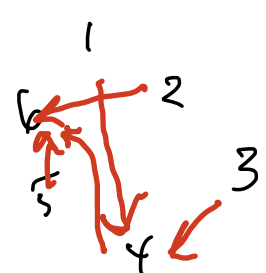
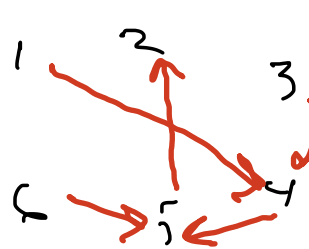
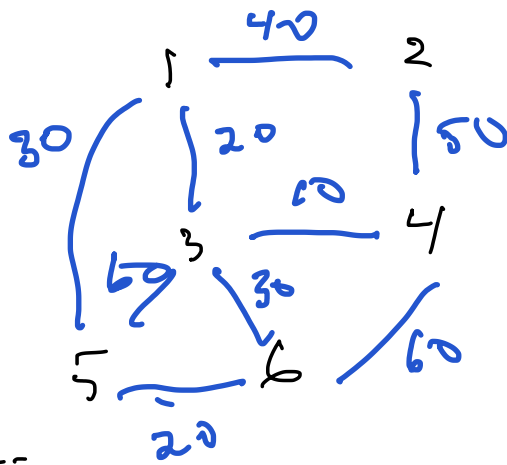
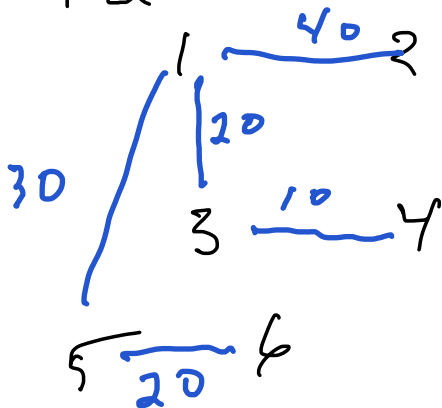
Kruskal's algorithm: (add edges)

start with all vertices

do  $v-1$  times

add best edge.

= edge with smallest weight that does not introduce a cycle.



Implementation: (1) sort all edges by weight.

(2) each next edge, see if adding it creates a cycle. If so, skip it.

# Cycle detection (Union find)

general idea: keep track for each vertex which component it belongs to.

operation: connect two vertices (union)

operation: are two vertices already connected (find)

Data structure:

for each vertex, store its representative.

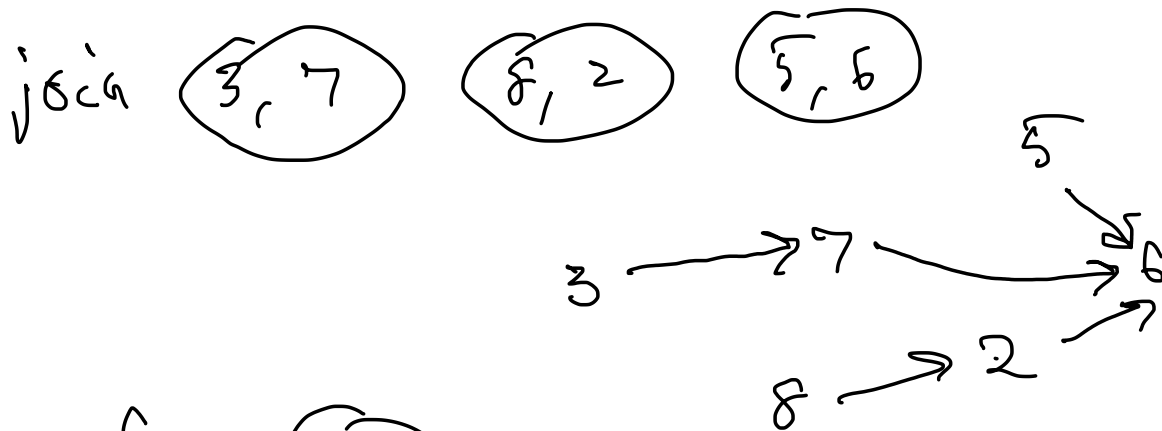
initially, the representative of a is a

join a to b.

Find a's representative A. *follow links*

Find b's representative B.

make B the representative of A.



find: (2, 5) *No.*

join (2, 5)

find: (3, 2) *No*

union (3, 2)

find (5, 8) *Yes. (in same component)*

# Improvements

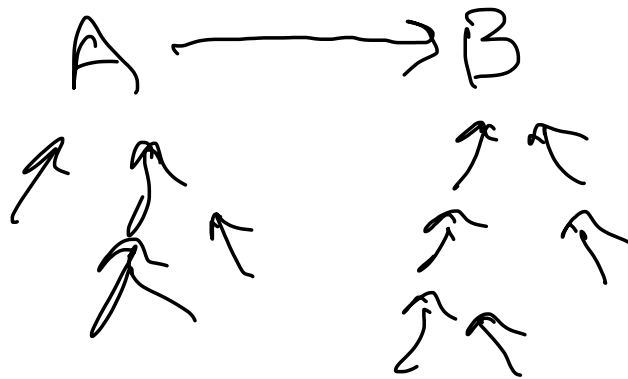
① Keep track of the height of each representative.

length of the longest path  
to that representative.

to connect representatives A, B

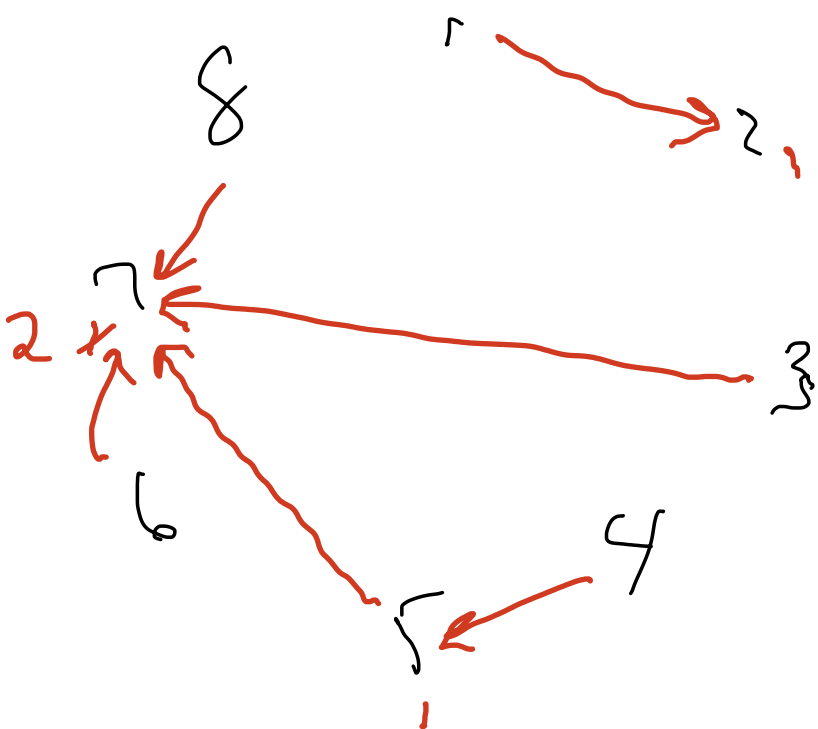
arrow goes to the greater-height  
representative.

Reason: avoid long  
paths.



② Compress paths as you follow them.  
re-link vertices on path to representative.

Reason: produces shorter paths.



U	3	7	U	1	2	
U	4	5	U	6	4	
X	F	5	8	F	5	8
U	4	3	F	1	4	
X	F	5	8			
U	3	8				
✓	F	5	8			

Why Union-Find? Kruskal's algorithm for minimum weight  
spanning tree.

# Complexity of Union-Find

How expensive to do a Union?

⇒ How expensive to find representative?

$$\Theta(\log^* n)$$

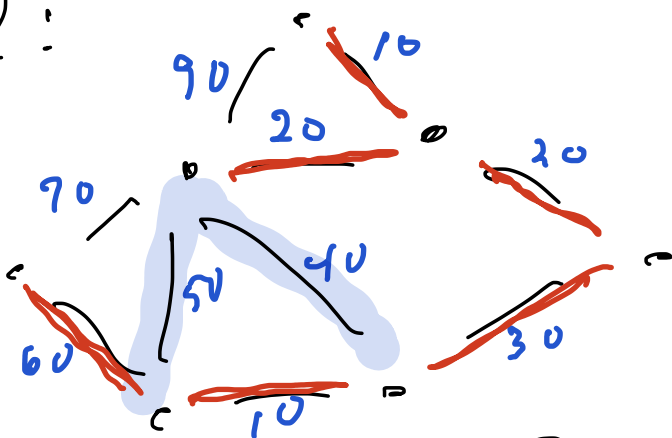
# of times you take log until result is  $< 1$ .

$$a = 31415926$$

$$\log_{10} a \approx 8$$

$$\log_{10}(\log_{10} a) = .9$$

Kruskal:



Data structure for Union-Find

```
typedef struct vertex_s {
```

```
    int name;
```

```
    struct vertex_s *representative;
```

```
    // null ⇒ me
```

```
    int depth; // 0 initially
```

```
}
```

# Numerical algorithms

Not real numbers, not approximate solutions.

(consider CS 321)

Instead, integer algorithms.

---

## Euclidean algorithm

to compute greatest common divisor of two integers.

$$\text{gcd}(12, 60) = 12$$

$$\text{gcd}(15, 66) = 3$$

$$\begin{array}{l} 3 \cdot 5 \quad 2 \cdot 3 \cdot 11 \\ \hline \end{array}$$

$$\text{gcd}(\cdot, \cdot)$$

$$\text{gcd}(15, 67) = 1$$

```
int gcd(int a, int b) {  
    while (b != 0) {  
        (a, b) = (b, a % b);  
    }  
    return a;  
}
```

a	12	60	12		
b	60	12	0		
a	15	66	15	6	3
b	66	15	6	3	0
a	15	67	15	7	1
b	67	15	7	1	0

$$\text{gcd}(33, 279)$$

a	33	279	33	15	3
b	279	33	15	3	0

---

# Fast exponentiation

$$243^{745} \pmod{452}$$

Why?  
cryptography.

$$\underbrace{243 \cdot 243 \cdot \dots \cdot 243}_{745}$$

Example.  $a^{64} = (((((a^2)^2)^2)^2)^2)^2$

$$\begin{array}{r} \hline a^4 \\ \hline a^8 \\ \hline a^{16} \\ \hline a^{32} \\ \hline a^{64} \end{array}$$

$$a^5 = a^4 \cdot a = (a^2)^2 \cdot a$$

$$a^{10} = \underbrace{\underbrace{(a^2)^2 \cdot a}_{a^5}}_{a^{10}}$$

Pattern:

express exponent in base 2,  
examine exponent left  $\rightarrow$  right,  
accumulator, starts a 1.

see 0: square accumulator  
see 1: square, multiply by a

$$a^{10} : 10_w = 1010_b$$

$$\left( \left( \left( 1^2 \cdot a \right)^2 \right)^2 \cdot a \right)^2$$

$$a^{24}$$

$$24_{10} = 11000_2$$

$$\left( \left( \left( \left( 1^2 \cdot a \right)^2 \cdot a \right)^2 \right)^2 \right)^2$$

If need to mod, do it repeatedly after every step.

$$(a^2)^2 \pmod b \quad \left( (a \pmod b)^2 \pmod b \right)^2 \pmod b$$

Complexity:  $a^P \pmod b$

# of steps = # of bits in  $p$ . =  $\log_2 P$

# of multiplications  $\leq 2 \cdot \# \text{ of steps}$

$$= 2 \log_2 P$$

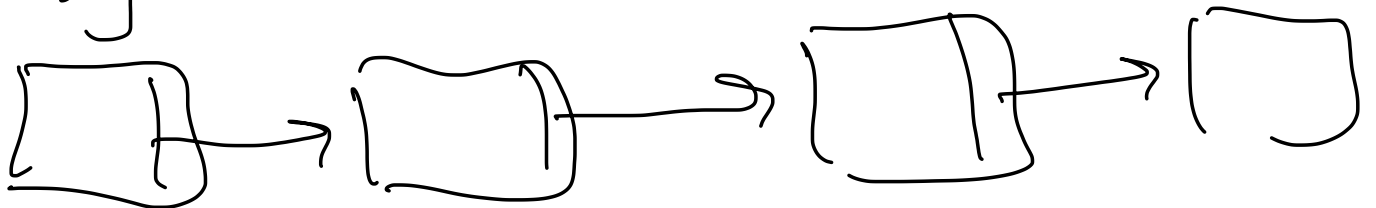
# of mod operations:  $\log_2 P$

total # of operations:  $\Theta(\log P)$

much better than  $\Theta(P)$

New question: How to multiply large integers?

Hint: Big Num representation.



$$26^{47} \pmod{17}$$

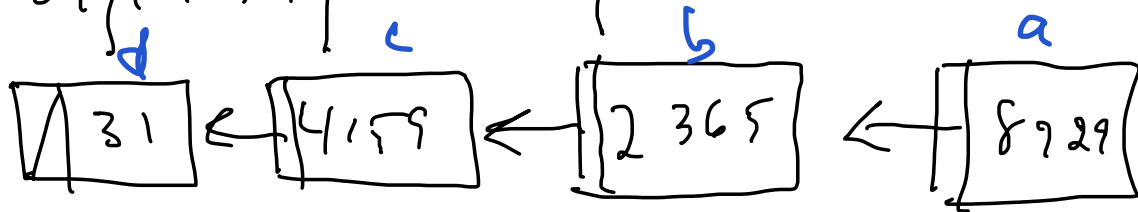
$$a^{47} \pmod m$$

$$47_{10} = 1011111_2$$

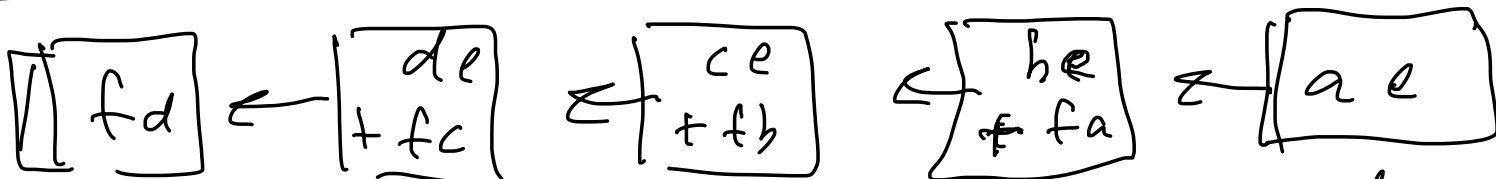
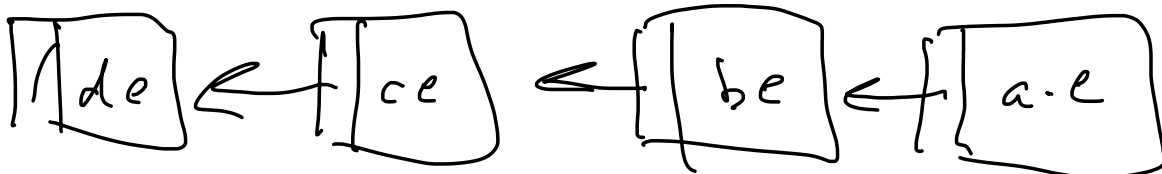
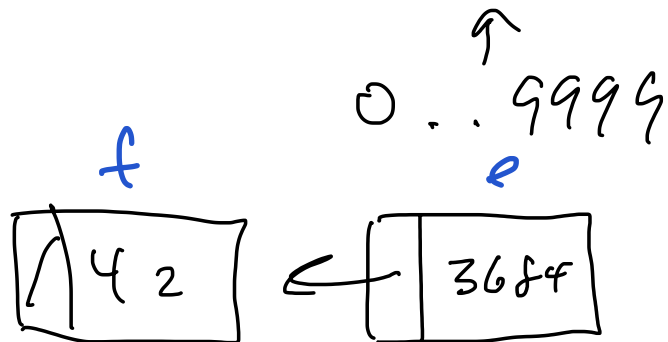
$$\left( \left( \left( \left( \left( 1^2 \cdot a \right)^2 \right)^2 \right)^2 \right)^2 \right)^2 \pmod m$$



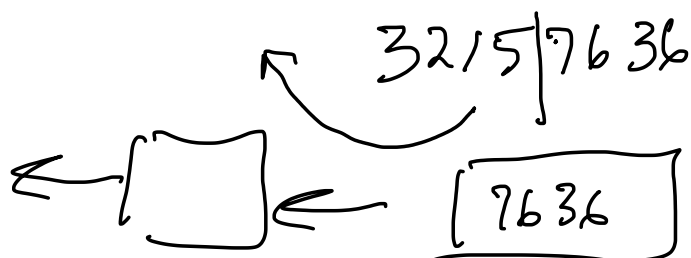
Consider:  $314159 | 2365 | 8929$



multiply by  $423684$



reduce



Complexity:  $n$  chunks in both operands

Calculate  $n \cdot n$  new chunks (before reducing)

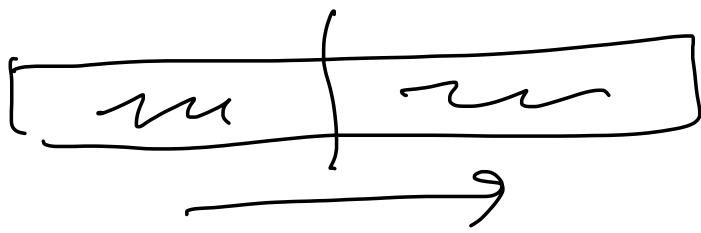
Add about  $n$  times, total of  $n \cdot n$  chunks.

Reductions:  $n$  chunks.

total cost:  $\Theta(n^2)$

Can we do better?

Anatoly Karatsuba (1962) divide + conquer algorithm.

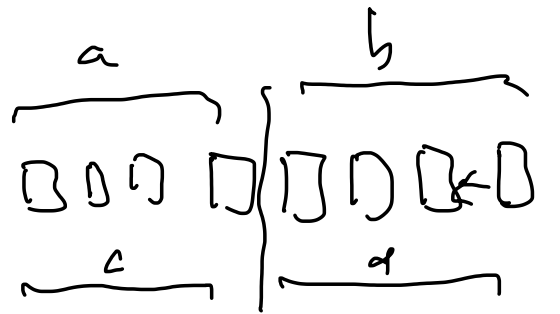


merge sort

multiply  $X \cdot y$

$$X = a \cdot 10^{n/2} + b$$

$$y = c \cdot 10^{n/2} + d$$



$n = \#$  of chunks (8 in this example)

$10 =$  limit per chunk (before I used 10000)

$$Xy = \underbrace{a \cdot c \cdot 10^n}_{\frac{n^2}{4}} + (bc + ad)10^{n/2} + bd$$

$$\frac{n^2}{4} + \frac{n^2}{4} + \frac{n^2}{4} + \frac{n^2}{4} = n^2$$

$$C_n = \underbrace{n^1}_K + 4C_{\underbrace{n/2}_a \underbrace{n/2}_b}$$

$$\frac{a}{4} > \frac{b^k}{2}$$

$$\Theta(n^{\log_b a})$$

$$\Theta(n^{\log_2 4})$$

$$\Theta(n^2)$$

$$X = a \cdot 10^{n/2} + b$$

$$y = c \cdot 10^{n/2} + d$$

$$u = ac \quad w = (a+b)(c+d)$$

$$v = bd$$

$$X \cdot y = u \cdot 10^n + (w - u - v) \cdot 10^{n/2} + v$$

$$w - u - v = ac + ad + bc + bd$$

$$C_n = n^k + 3 C_{n/2}$$

$$a \quad b^k$$

$$3 > 2$$

$$\Theta(n^{\log_b a})$$

$$\Theta(n^{\log_2 3})$$

$$\approx \Theta(n^{1.585})$$

(if  $n=100$  ( $x, y$  are 100 chunks long))

cost reduces from 10000 ops  
to 1480 ops.

"super linear"  
"sub quadratic"

How big should the chunk limit be?

- 1) should fit in integer.
- 2) double size should fit in an integer.
- 3) reduction fast: mask, shift  $\Rightarrow$  power of 2.
- 4) 64-bit arithmetic

$\Rightarrow$  31 bits of a chunk. limit  $= 2^{31} - 1 \approx 2G$ .

text  $t$ : this is the first primeval . . .

$$|t| = n$$

$\uparrow$  length

pattern  $p$ :  $es$

$$|p| = m$$

