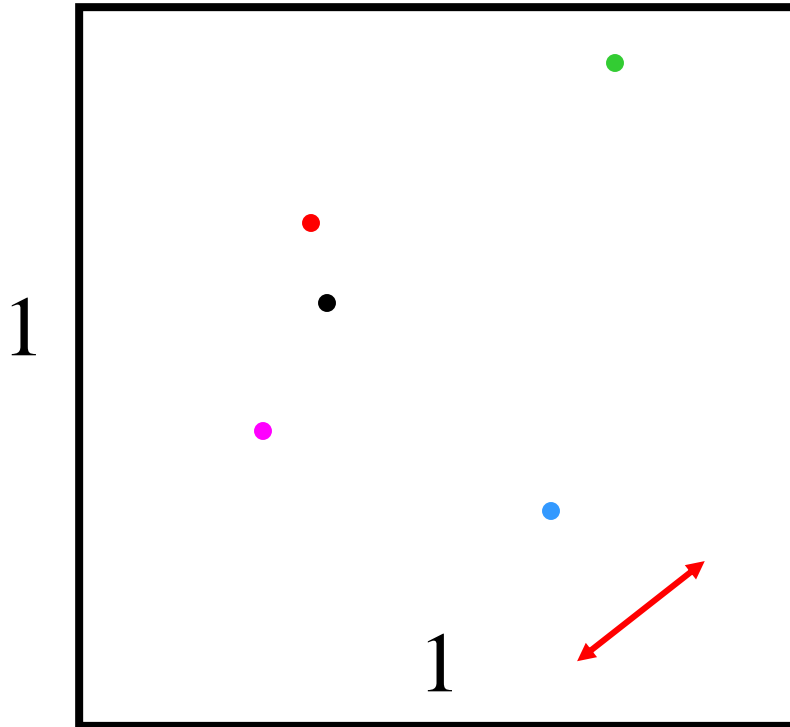
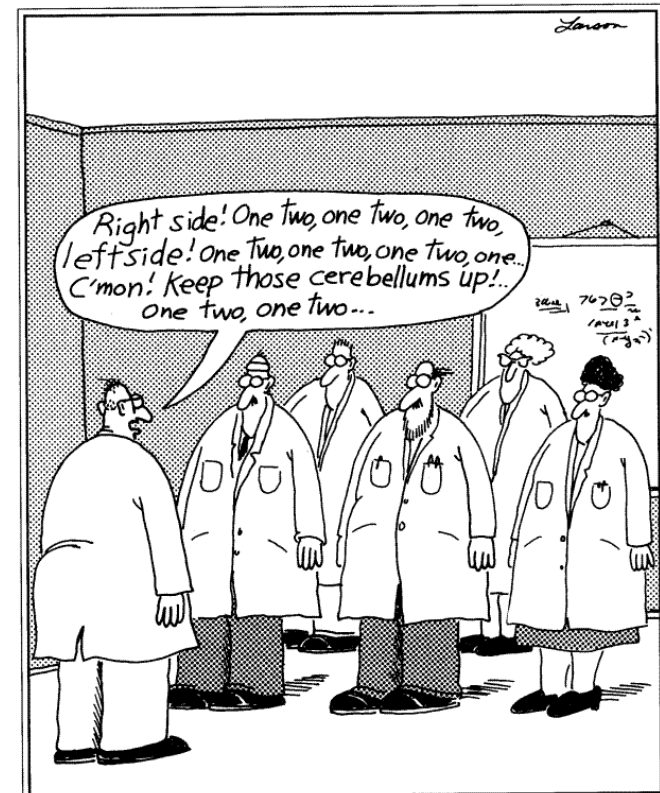


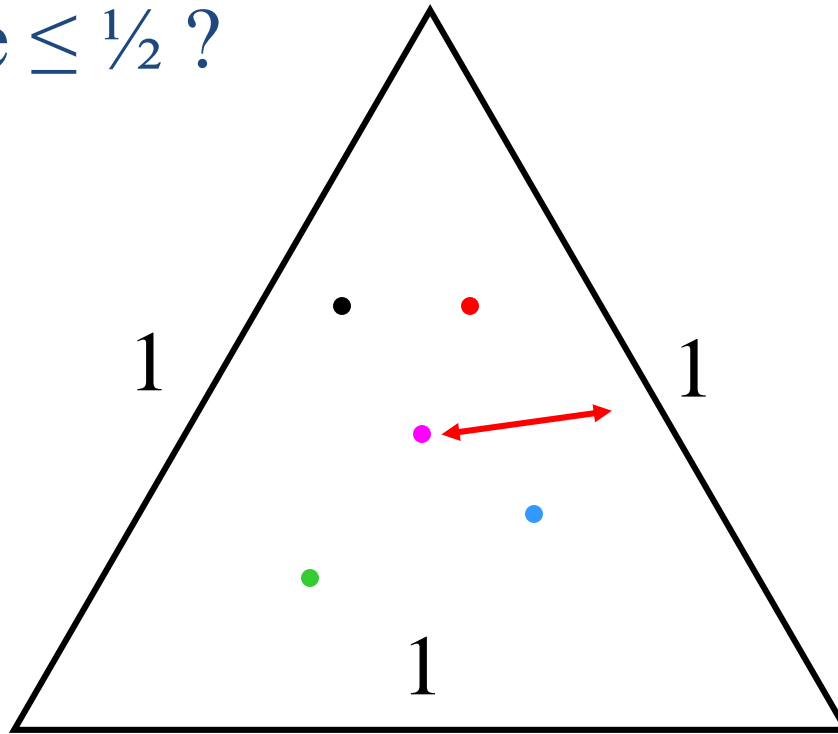
**Problem:** Given any five points in/on the unit square, is there always a pair with distance  $\leq \frac{1}{\sqrt{2}}$  ?



- What approaches fail?
- What techniques work and why?
- Lessons and generalizations



**Problem:** Given any five points in/on the unit equilateral triangle, is there always a pair with distance  $\leq \frac{1}{2}$  ?

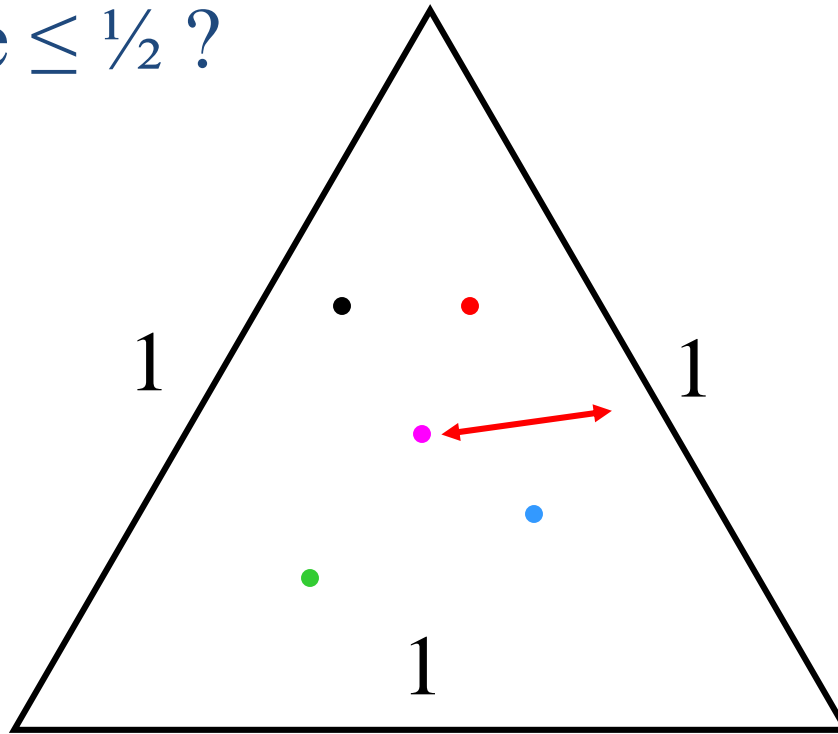


- What approaches fail?
- What techniques work and why?
- Lessons and generalizations



Math phobic's nightmare

**Problem:** Given any five points in/on the unit equilateral triangle, is there always a pair with distance  $\leq \frac{1}{2}$  ?

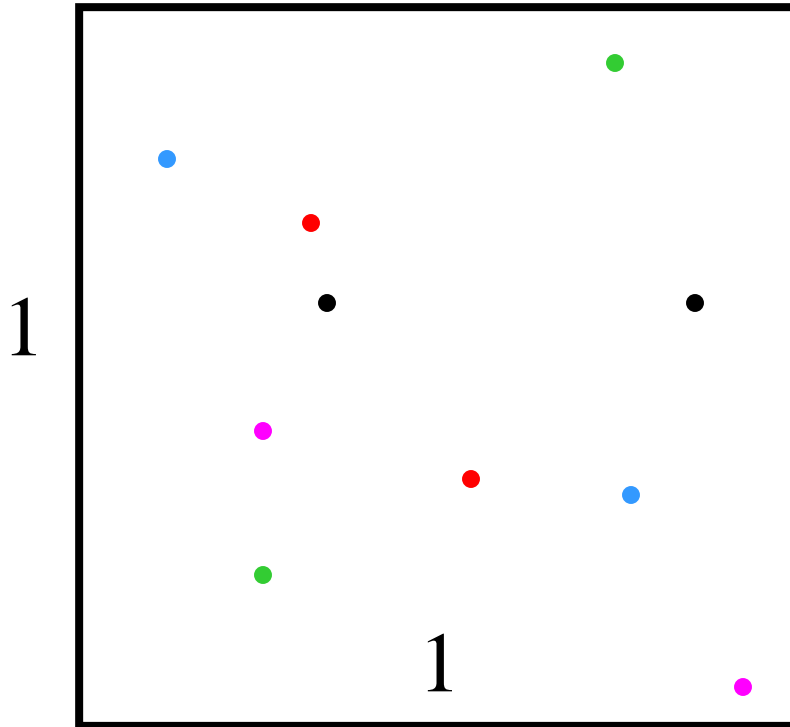


- What approaches fail?
- What techniques work and why?
- Lessons and generalizations

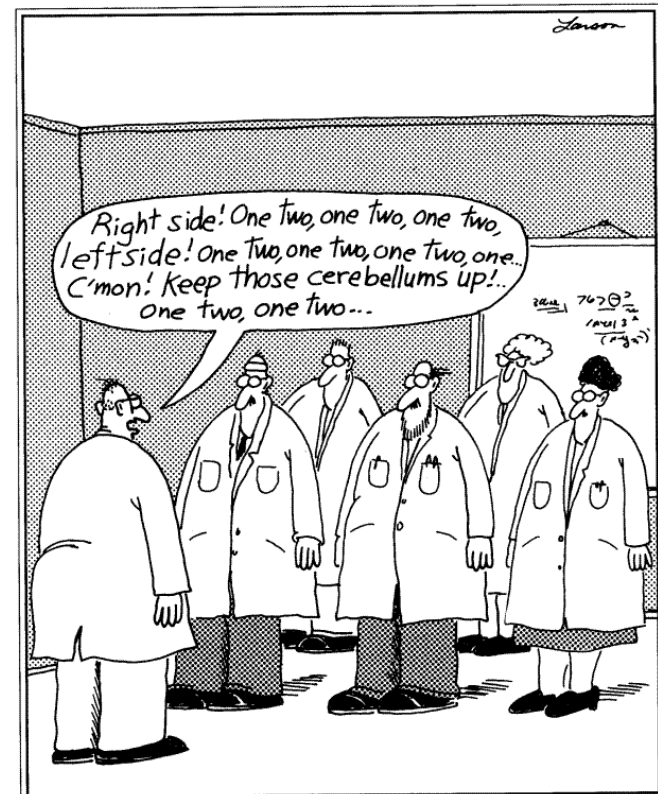


Math phobic's nightmare

**Problem:** Given any ten points in/on the unit square, what is the maximum pairwise distance?



- What approaches fail?
- What techniques work and why?
- Lessons and generalizations



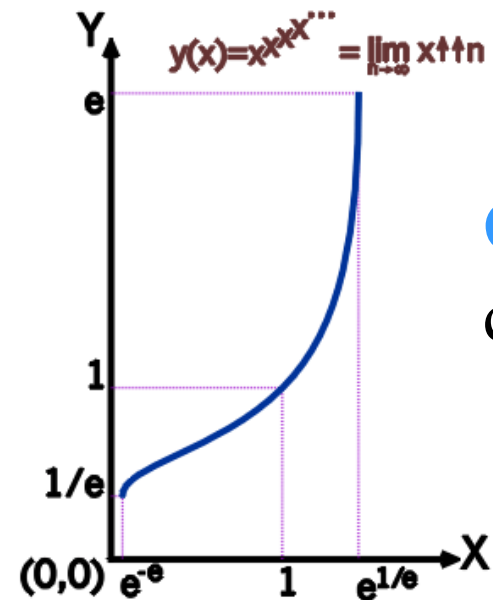
**Problem:** Solve the following equation for X:

$$X^{X^{X^{X^{\dots}}}} = 2 \Rightarrow X^2 = 2 \Rightarrow X = \sqrt{2}$$

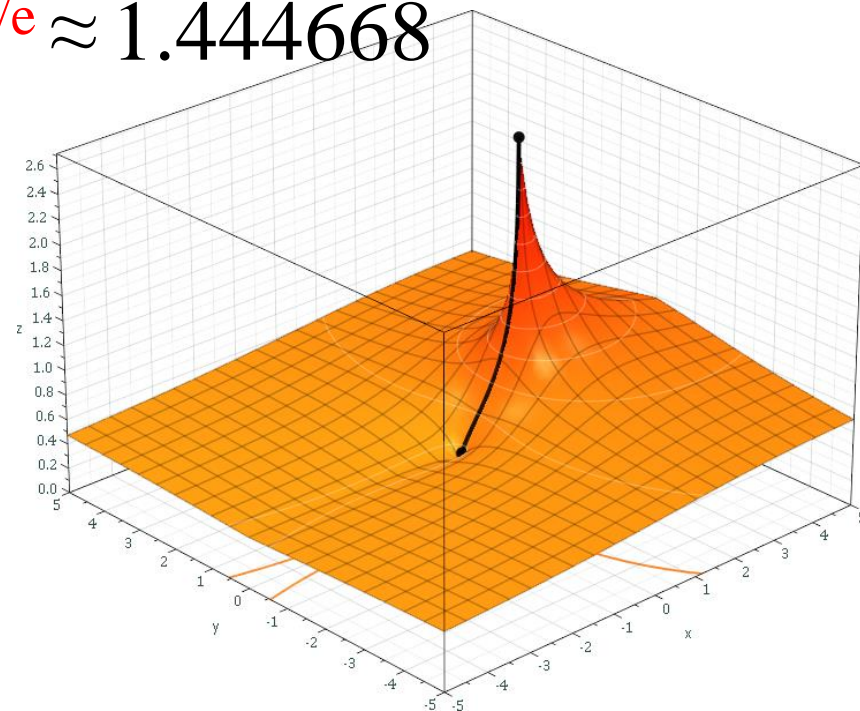
where the stack of exponentiated x's extends forever.

This “power tower” **converges** for:

$$0.065988 \approx e^{-e} < X < e^{1/e} \approx 1.444668$$



Generalization to  
complex numbers:





[All](#)
[Videos](#)
[Maps](#)
[News](#)
[Images](#)
[More](#)
[Search tools](#)

About 5,680,000 results (0.81 seconds)

$$)^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}^{\sqrt{2}}}}}}}}}} =$$

**1.99820347751**

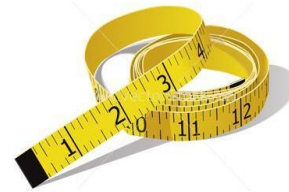
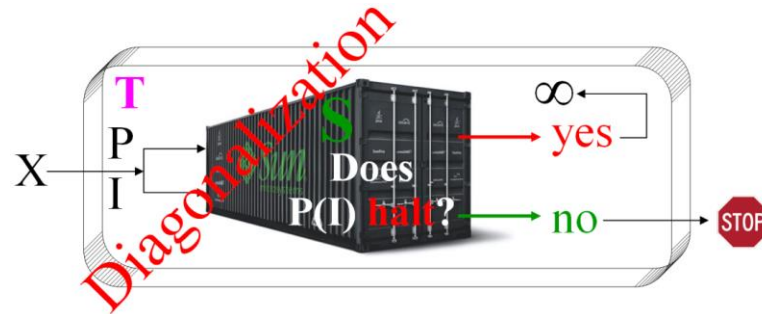
Rad		x!	(	)	%	AC
Inv	sin	ln	7	8	9	÷
π	cos	log	4	5	6	×
e	tan	√	1	2	3	−
Ans	EXP	x <sup>y</sup>	0	.	=	+

# Algorithms

1. Existence

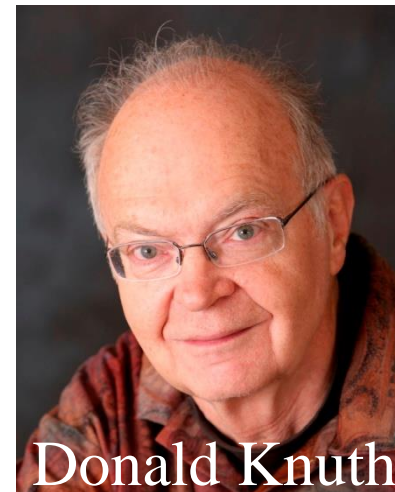
2. Efficiency

- Time
- Space



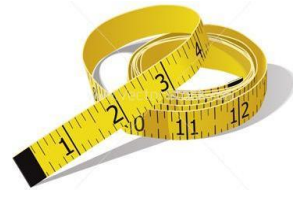
**Worst case** behavior analysis  
as a function of input size

Asymptotic growth:  $O$   $\Omega$   $\Theta$   $o$   $\omega$



Donald Knuth

# Upper Bounds



Definition:  $f(n) = O(g(n))$

$$\Leftrightarrow \exists c, k > 0 \ni 0 \leq f(n) \leq c \cdot g(n) \quad \forall n > k$$

$$\Leftrightarrow \lim_{n \rightarrow \infty} f(n) / g(n) \text{ exists}$$

$$O(g(n)) = \{ f \mid \exists c, k > 0 \ni 0 \leq f(n) \leq c \cdot g(n) \quad \forall n > k \}$$

“ $f(n)$  is big-O of  $g(n)$ ”

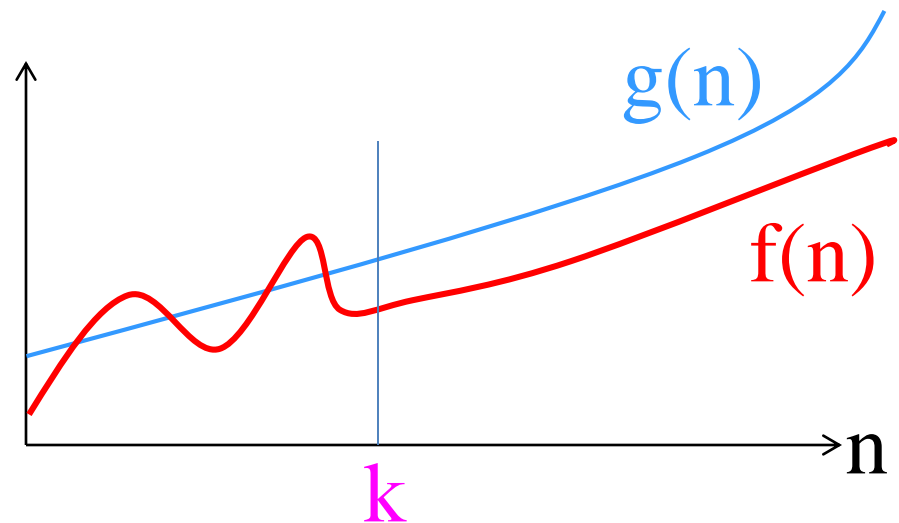
Ex:  $n = O(n^2)$

$$33n + 17 = O(n)$$

$$n^8 + n^7 = O(n^{12})$$

$$n^{100} = O(2^n)$$

$$213 = O(1)$$





# Lower Bounds



Definition:  $f(n) = \Omega(g(n))$

$$\Leftrightarrow g(n) = O(f(n))$$

$$\Leftrightarrow \lim_{n \rightarrow \infty} g(n) / f(n) \text{ exists}$$

$$\Omega(g(n)) = \{ f \mid \exists c, k > 0 \ni 0 \leq g(n) \leq c \cdot f(n) \forall n > k \}$$

“ $f(n)$  is Omega of  $g(n)$ ”

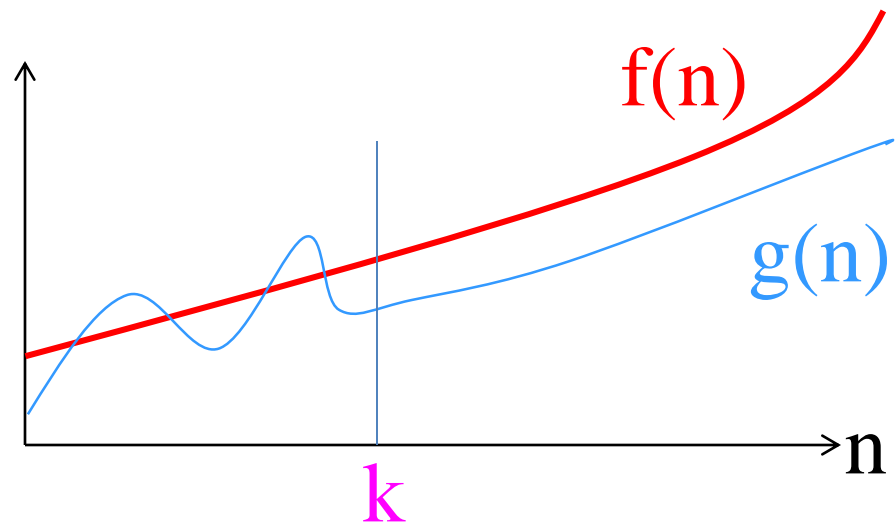
Ex:  $100n = \Omega(n)$

$$33n + 17 = \Omega(\log n)$$

$$n^8 - n^7 = \Omega(n^8)$$

$$213 = \Omega(1/n)$$

$$10^{100} = \Omega(1)$$



# Tight Bounds



Definition:  $f(n) = \Theta(g(n))$

$$\Leftrightarrow f(n) = O(g(n)) \text{ and } g(n) = O(f(n))$$

$$\Leftrightarrow f(n) = O(g(n)) \text{ and } f(n) = \Omega(g(n))$$

$$\Leftrightarrow \lim_{n \rightarrow \infty} g(n)/f(n) \text{ and } \lim_{n \rightarrow \infty} f(n)/g(n) \text{ exist}$$

“ $f(n)$  is Theta of  $g(n)$ ”

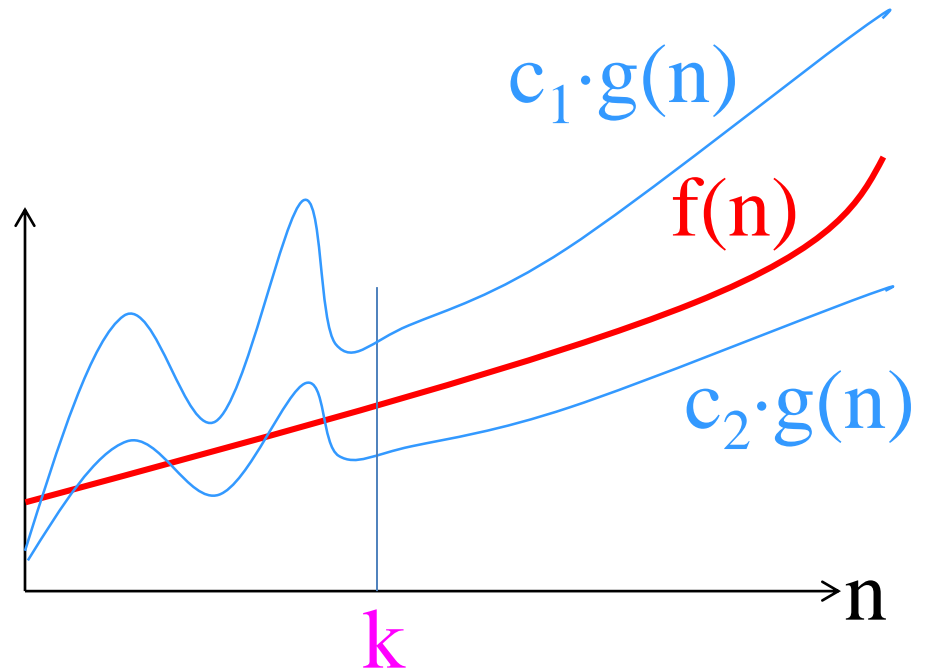
Ex:  $99n = \Theta(n)$

$$n + \log n = \Theta(n)$$

$$n^8 - n^7 = \Theta(n^8)$$

$$n^2 + \cos(n) = \Theta(n^2)$$

$$213 = \Theta(1)$$



# Loose Bounds



Definition:  $f(n) = o(g_1(n))$

$$\Leftrightarrow f(n) = O(g_1(n)) \text{ and } f(n) \neq \Omega(g_1(n))$$

“ $f(n)$  is little-o of  $g_1(n)$ ”

Definition:  $f(n) = \omega(g_2(n))$

$$\Leftrightarrow f(n) = \Omega(g_2(n)) \text{ and } f(n) \neq O(g_2(n))$$

“ $f(n)$  is little-omega of  $g_2(n)$ ”

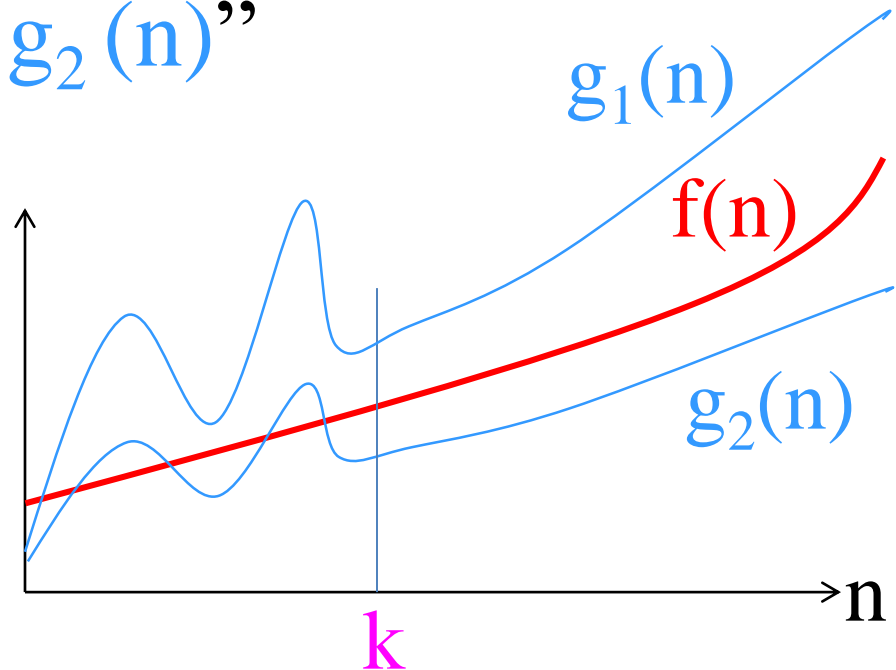
Ex:  $8n = o(n \log \log n)$

$$n \log n = \omega(n)$$

$$n^6 = o(n^{6.01})$$

$$n^2 + \sin(n) = \omega(n)$$

$$213 = o(\log n)$$



# Growth Laws



Let  $f_1(n) = O(g_1(n))$  and  $f_2(n) = O(g_2(n))$

**Thm:**  $f_1(n) + f_2(n) = O(\max(g_1(n), g_2(n)))$

- Sequential code

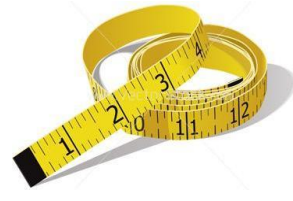
**Thm:**  $f_1(n) \cdot f_2(n) = O(g_1(n) \cdot g_2(n))$

- Nested loops & subroutine calls

**Thm:**  $n^k = O(c^n) \quad \forall c, k > 0$

**Ex:**  $n^{1000} = O(1.001^n)$

# Solving Recurrences



$$T(n) = a \cdot T(n/b) + f(n)$$

$$a \geq 1, b > 1, \text{ and let } c = \log_b a$$

$$\text{Thm: } f(n) = O(n^{c-\varepsilon}) \text{ for some } \varepsilon > 0 \Rightarrow T(n) = \Theta(n^c)$$

$$f(n) = \Theta(n^c) \Rightarrow T(n) = \Theta(n^c \log n)$$

$$f(n) = \Omega(n^{c+\varepsilon}) \text{ some } \varepsilon > 0 \text{ and } a \cdot f(n/b) \leq d \cdot f(n)$$

$$\text{for some } d < 1 \ \forall n > n_0 \Rightarrow T(n) = \Theta(f(n))$$

$$\text{Ex: } T(n) = 2T(n/2) + n \Rightarrow T(n) = \Theta(n \log n)$$

$$T(n) = 9T(n/3) + n \Rightarrow T(n) = \Theta(n^2)$$

$$T(n) = T(2n/3) + 1 \Rightarrow T(n) = \Theta(\log n)$$

# Stirling's Formula

**Factorial:**  $n! = 1 \cdot 2 \cdot 3 \cdot \dots \cdot (n-2) \cdot (n-1) \cdot n$

**Theorem:**  $n! = \sqrt{2\pi n} \cdot \left(\frac{n}{e}\right)^n \cdot \left(1 + \Theta\left(\frac{1}{n}\right)\right)$

where  $e$  is Euler's constant = 2.71828...

**Theorem:**  $n! \approx \sqrt{2\pi n} \cdot \left(\frac{n}{e}\right)^n$

**Corollary:**  $\log(n!) \approx \log\left(\sqrt{2\pi n} \cdot \left(\frac{n}{e}\right)^n\right) = n \cdot \log\left(\frac{n}{e}\right) + \frac{\log(2\pi n)}{2} = O(n \log n)$

**$\log(n!) = O(n \log n)$**

- Useful in analyses and bounds

# Data Structures

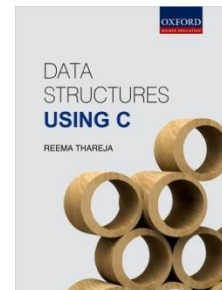
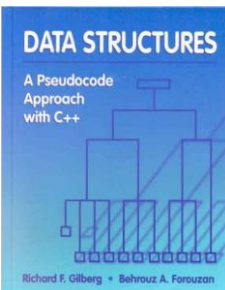
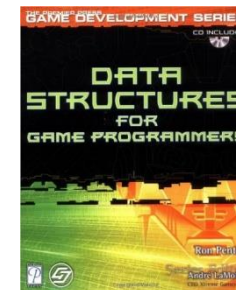
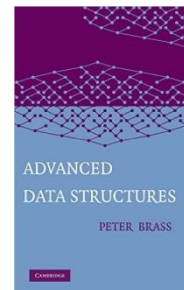
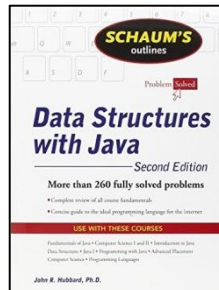
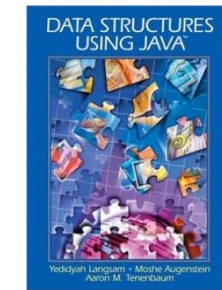
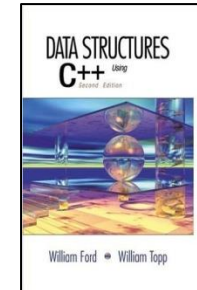
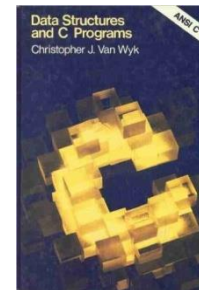
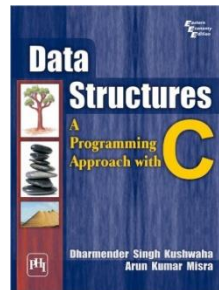
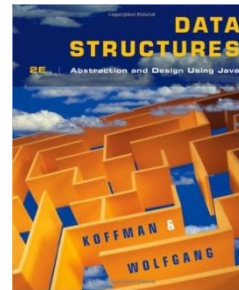
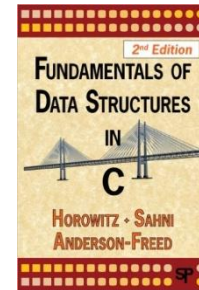
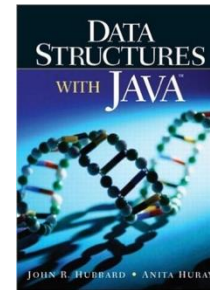
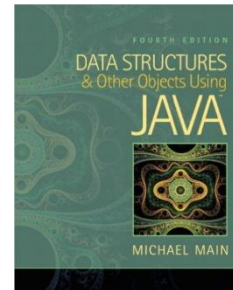
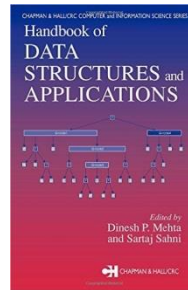
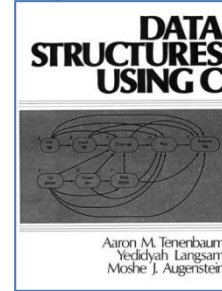
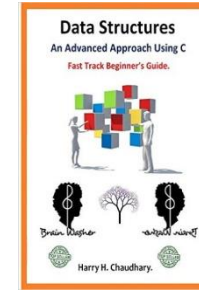
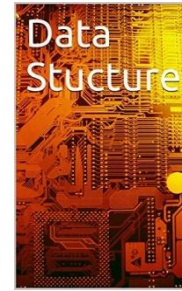
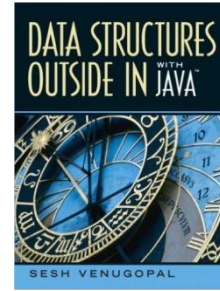


# Data Structures

- Techniques for organizing information effectively

- Allowed operations:

- Initialize
- Insert
- Delete
- Search
- Min/max
- Successor
- Predecessor
- Merge
- Split
- Revert





# Data Structures

## Primitive types:

1. Boolean
2. Character
3. Floating-point
4. Double
5. Integer
6. Enumerated type

## Abstract data types:

7. **Array**
8. Container
9. Map
10. Associative array
11. Dictionary
12. Multimap
13. **List**
14. Set
15. Multiset / Bag
16. **Priority queue**
17. **Queue**
18. Double-ended queue
19. **Stack**
20. String
21. **Tree**
22. **Graph**

## Composite types:

23. **Array**
24. Record
25. Union
26. Tagged union

## Arrays:

27. **Bit array**
28. Bit field
29. Bitboard
30. **Bitmap**
31. Circular buffer
32. Control table
33. Image
34. Dynamic array
35. Gap buffer
36. Hashed array tree
37. Heightmap
38. **Lookup table**
39. **Matrix**
40. Parallel array
41. **Sorted array**
42. **Sparse array**
43. Sparse matrix
44. Iliffe vector
45. Variable-length array

## Lists:

46. **Doubly linked list**
47. Array list
48. **Linked list**
49. Self-organizing list
50. Skip list
51. Unrolled linked list
52. VList
53. Xor linked list
54. Zipper
55. Doubly connected edge list
56. Difference list
57. Free list

## Binary trees:

58. AA tree
59. **AVL tree**
60. **Binary search tree**
61. **Binary tree**
62. Cartesian tree
63. Order statistic tree
64. Pagoda
65. Randomized binary search tree
66. **Red-black tree**
67. Rope

# Data Structures

## Binary trees (continued):

- 68. Scapegoat tree
- 69. Self-balancing search tree
- 70. Splay tree
- 71. T-tree
- 72. Tango tree
- 73. Threaded binary tree
- 74. Top tree
- 75. Treap
- 76. Weight-balanced tree
- 77. Binary data structure

## Trees:

- 78. Trie
- 79. Radix tree
- 80. Suffix tree
- 81. Suffix array
- 82. Compressed suffix array
- 83. FM-index
- 84. Generalised suffix tree
- 85. B-trie
- 86. Judy array
- 87. X-fast trie
- 88. Y-fast trie
- 89. Ctrie

## B-trees:

- 90. B-tree
- 91. B+ tree
- 92. B\*-tree
- 93. B sharp tree
- 94. Dancing tree
- 95. 2-3 tree
- 96. 2-3-4 tree
- 97. Queap
- 98. Fusion tree
- 99. Bx-tree
- 100. AList

## Heaps:

- 101. Heap
- 102. Binary heap
- 103. Weak heap
- 104. Binomial heap
- 105. Fibonacci heap
- 106. AF-heap
- 107. Leonardo Heap
- 108. 2-3 heap
- 109. Soft heap
- 110. Pairing heap
- 111. Leftist heap
- 112. Treap

- 113. Beap
- 114. Skew heap
- 115. Ternary heap
- 116. D-ary heap
- 117. Brodal queue

## Multiway trees:

- 118. Ternary tree
- 119. K-ary tree
- 120. And-or tree
- 121. (a,b)-tree
- 122. Link/cut tree
- 123. SPQR-tree
- 124. Spaghetti stack
- 125. Disjoint-set data structure
- 126. Fusion tree
- 127. Enfilade
- 128. Exponential tree
- 129. Fenwick tree
- 130. Van Emde Boas tree
- 131. Rose tree

## Space-partitioning trees:

- 132. Segment tree
- 133. Interval tree
- 134. Range tree

# Data Structures

## Space-partitioning trees (cont):

- 135. Bin
- 136. Kd-tree
- 137. Implicit kd-tree
- 138. Min/max kd-tree
- 139. Adaptive k-d tree
- 140. Quadtree
- 141. Octree
- 142. Linear octree
- 143. Z-order
- 144. UB-tree
- 145. R-tree
- 146. R+ tree
- 147. R\* tree
- 148. Hilbert R-tree
- 149. X-tree
- 150. Metric tree
- 151. Cover tree
- 152. M-tree
- 153. VP-tree
- 154. BK-tree
- 155. Bounding interval hierarchy
- 156. BSP tree
- 157. Rapidly exploring random tree

## Application-specific trees:

- 158. Abstract syntax tree
- 159. Parse tree
- 160. Decision tree
- 161. Alternating decision tree
- 162. Minimax tree
- 163. Expectiminimax tree
- 164. Finger tree
- 165. Expression tree
- 166. Log-structured merge-tree

## Hashes:

- 167. Bloom filter
- 168. Count-Min sketch
- 169. Distributed hash table
- 170. Double Hashing
- 171. Dynamic perfect hash table
- 172. Hash array mapped trie
- 173. Hash list
- 174. Hash table
- 175. Hash tree
- 176. Hash trie
- 177. Koorde
- 178. Prefix hash tree
- 179. Rolling hash

- 180. MinHash
- 181. Quotient filter
- 182. Ctrie

## Graphs:

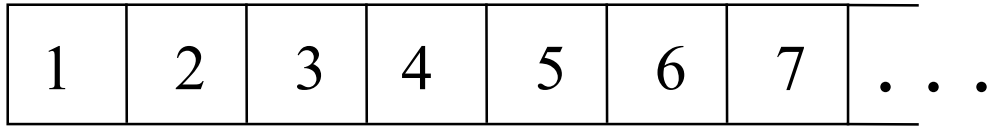
- 183. Graph
- 184. Adjacency list
- 185. Adjacency matrix
- 186. Graph-structured stack
- 187. Scene graph
- 188. Binary decision diagram
- 189. 0-suppressed decision diagram
- 190. And-inverter graph
- 191. Directed graph
- 192. Directed acyclic graph
- 193. Propositional dir. acyclic graph
- 194. Multigraph
- 195. Hypergraph

## Other:

- 196. Lightmap
- 197. Winged edge
- 198. Doubly connected edge list
- 199. Quad-edge
- 200. Routing table
- 201. Symbol table

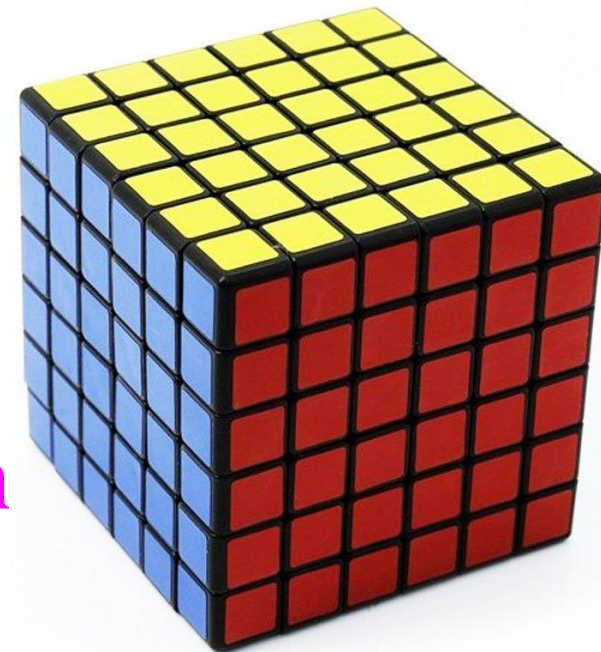
# Arrays

- Sequence of "indexible" locations



- Unordered:
  - $O(1)$  to **add**
  - $O(n)$  to **search** / **delete**
  - $O(n)$  for min / max

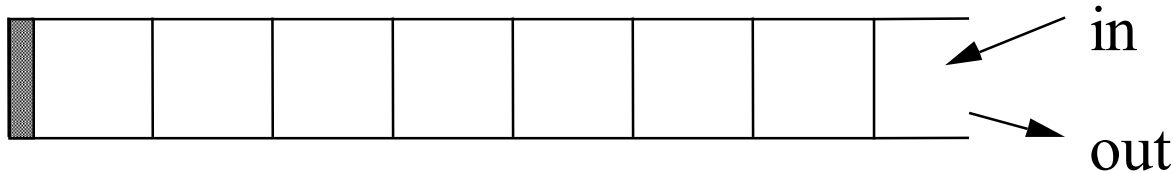
- Ordered:
  - $O(n)$  to **add** / **delete**
  - $O(\log n)$  to (binary) **search**
  - $O(1)$  for min / max



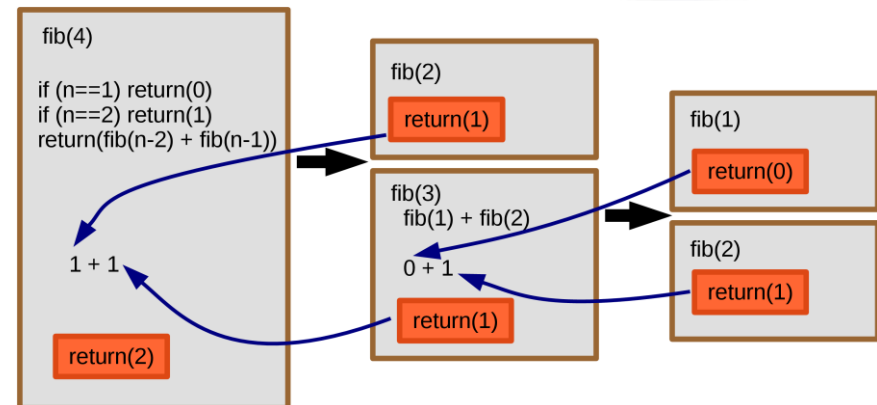
# Stacks



- **LIFO** (Last-In First-Out)



- Operations: **push** / **pop**  $O(1)$  each
- Can not access “middle”
- Analogy: trays/plates at cafeteria
- Applications:
  - Recursion
  - Compiling / parsing
  - Dynamic binding
  - Web surfing

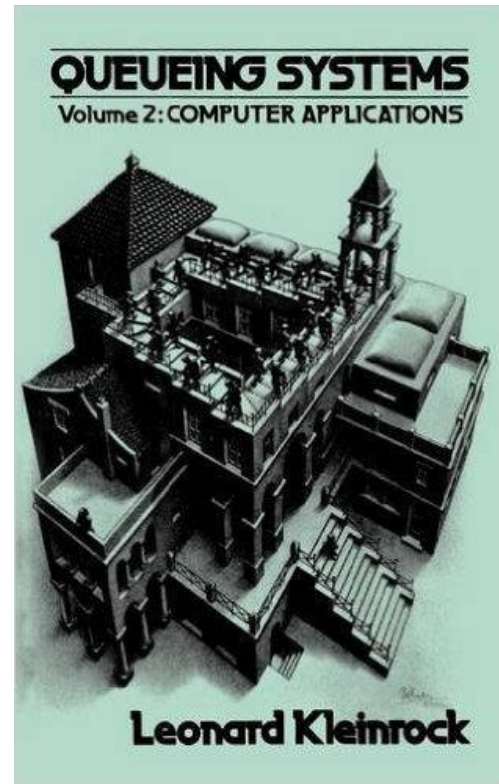


# Queues

- **FIFO** (First-In First-Out)



- Operations: **push** / **pop**  $O(1)$  each
- Can not access “middle”
- Analogy: line at the store
- Applications:
  - Simulations
  - Scheduling
  - Networks
  - Operating systems

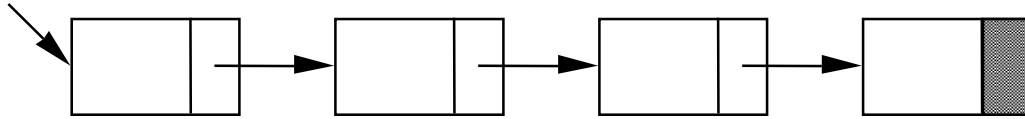


# Linked Lists

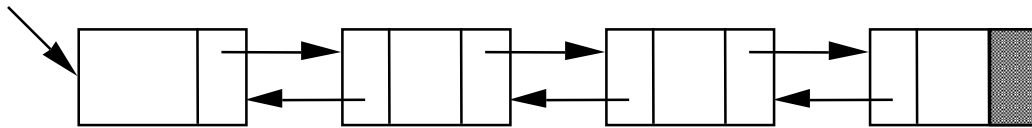
- Successor / predecessor pointers

- Types:

- Single linked



- Double linked

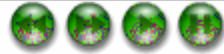
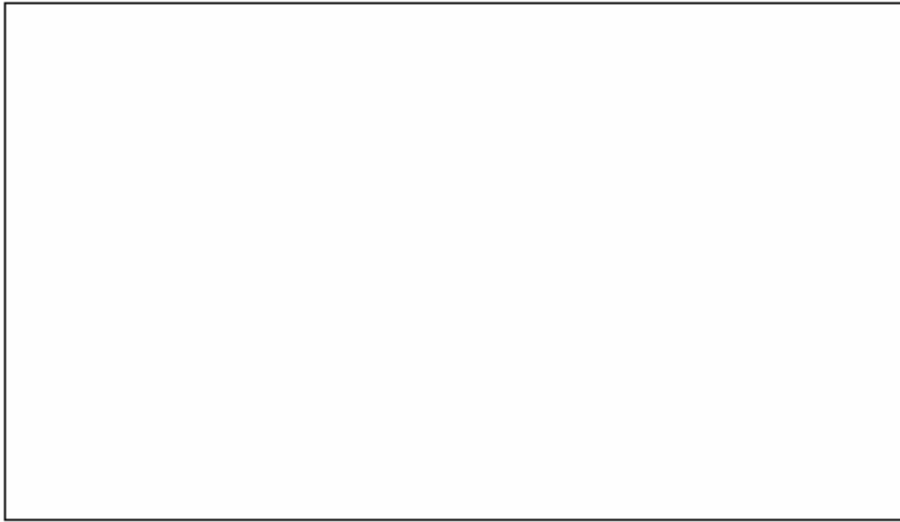


- Circular

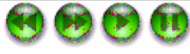
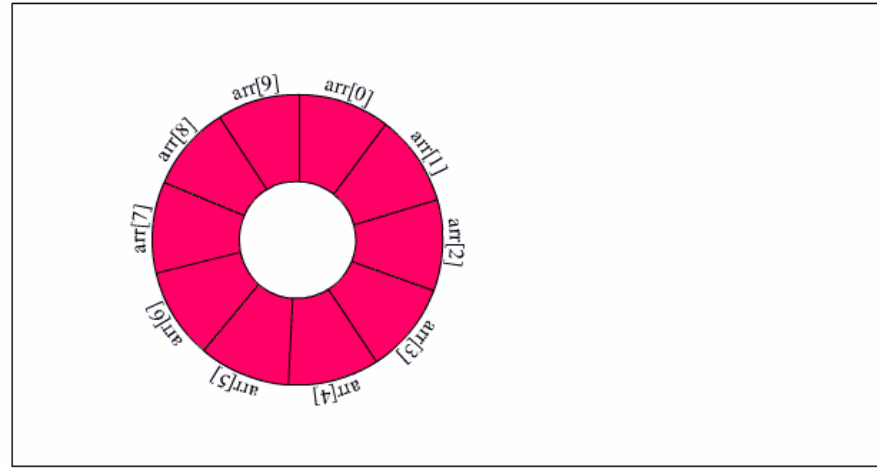
- Operations:

- **Add**:  $O(1)$  time
- **Search**:  $O(n)$  time
- **Delete**:  $O(1)$  time (given pointer)

## Building a linked list

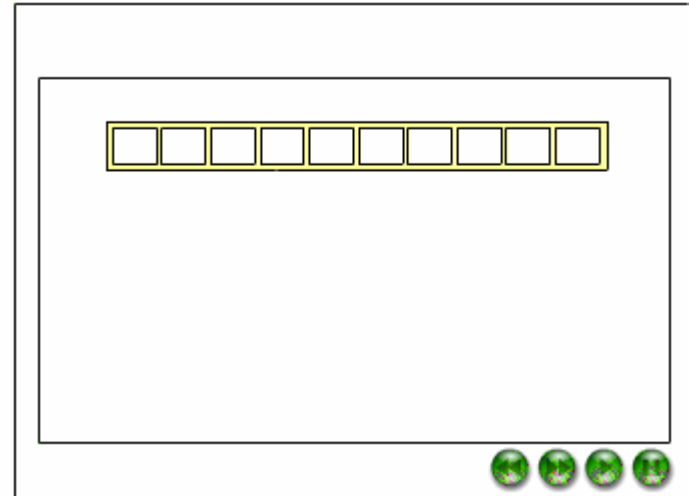
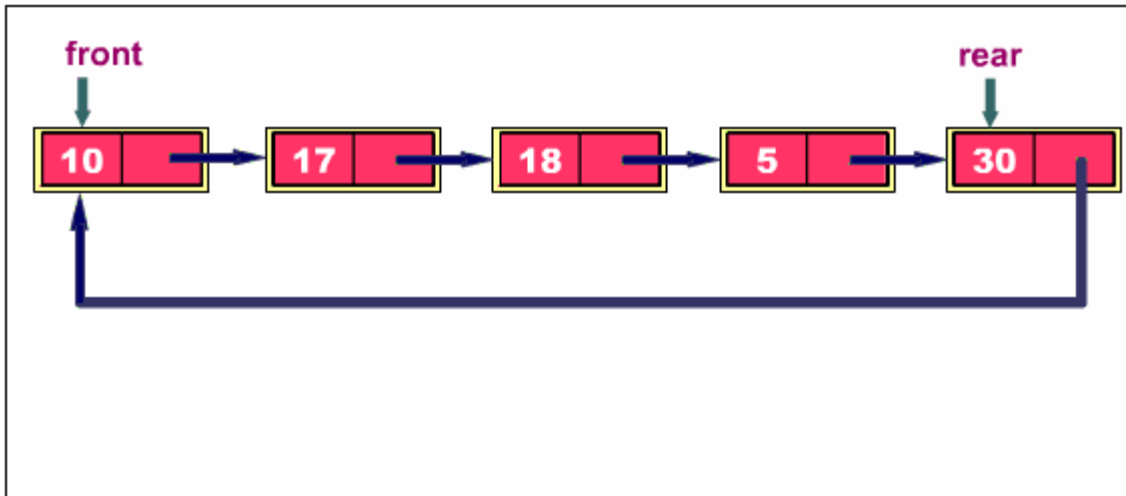


## Building of Circular Queue



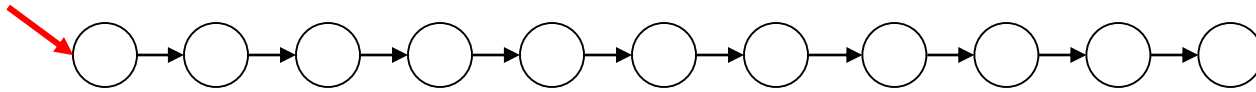
## Circular queue as a linked list

### Deletion of a node

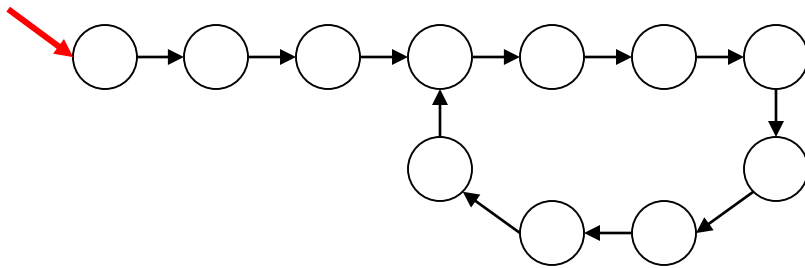




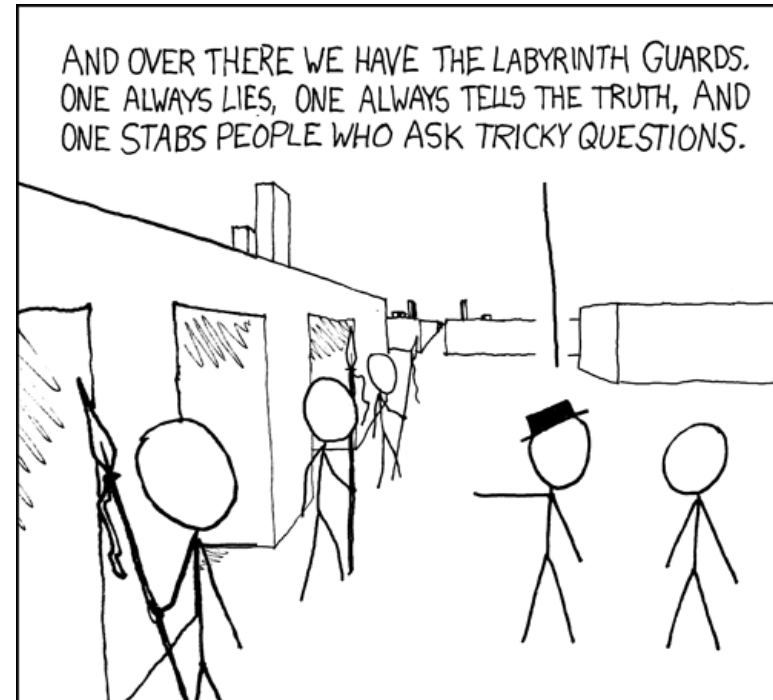
**Extra Credit Problem:** Given a pointer to a **read-only** (unmodifiable) linked list containing an **unknown number** of nodes  $n$ , devise an  **$O(n)$** -time and  **$O(1)$**  space algorithm that determines whether that list contains a cycle.



or

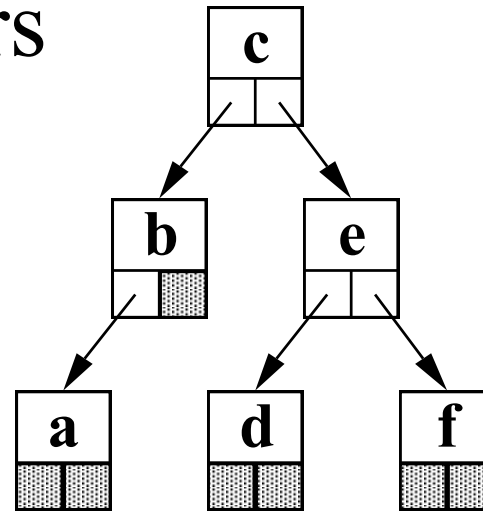


- What approaches fail?
- What techniques work and why?
- Lessons and generalizations

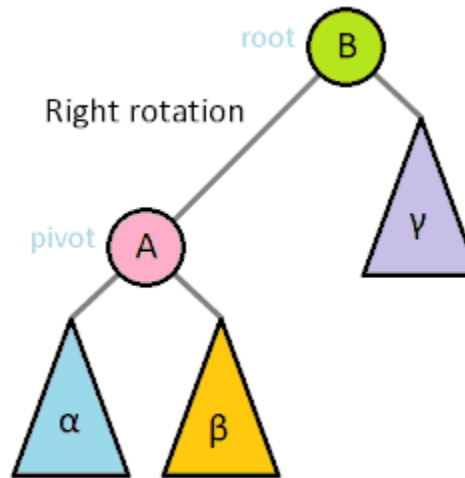


# Trees

- Parent/children pointers
- Binary / N-ary
- Ordered / unordered
- Height-balanced:



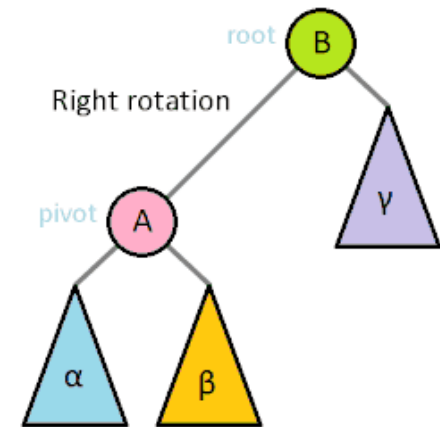
- B-trees
- AVL trees
- Red-black trees
- 2-3 trees
- **add** / **delete** / **search** in  $O(\log n)$  time



# B-Trees



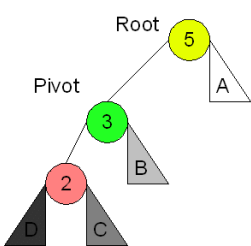
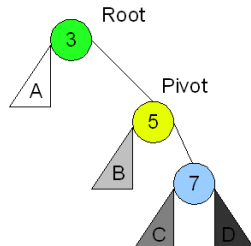
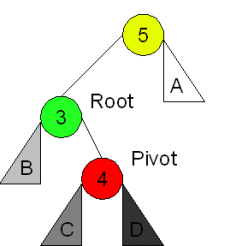
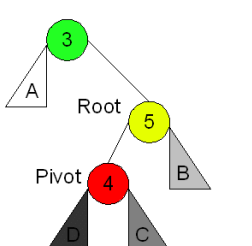
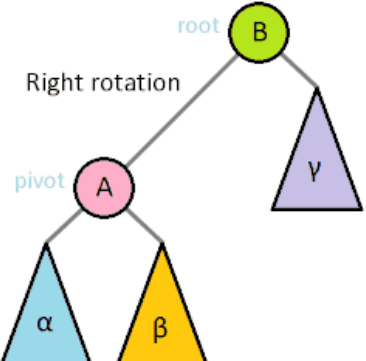
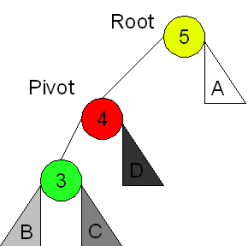
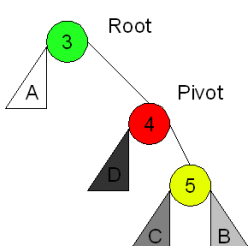
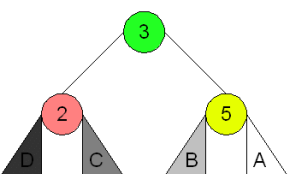
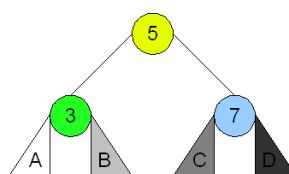
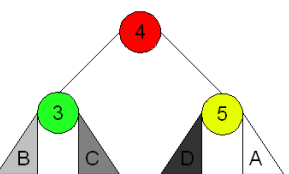
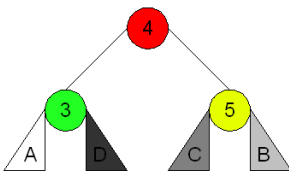
- Multi-rotations occur infrequently
- Rotations don't propagate far
- Larger tree  $\Rightarrow$  fewer rotations
- Same for other height-balanced trees
- Non-balanced search trees **average**  $O(\log n)$  height



# Height-Balanced AVL Trees

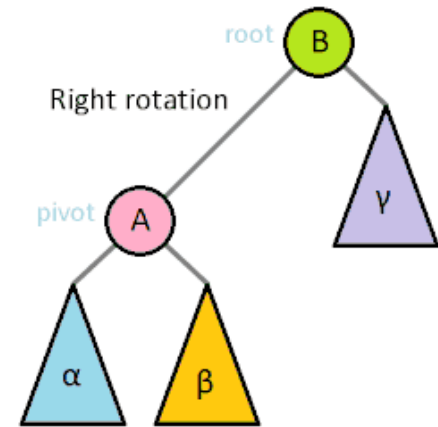
There are 4 cases in all, choosing which one is made by seeing the direction of the first 2 nodes from the unbalanced node to the newly inserted node and matching them to the top most row.

**Root** is the initial parent before a rotation and **Pivot** is the child to take the root's place.

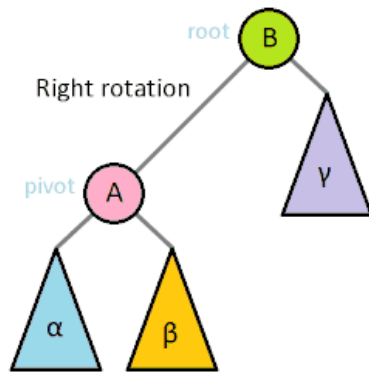
<p><b>Left Left Case</b></p>  <p><b>Right Rotation</b></p>	<p><b>Right Right Case</b></p>  <p><b>Left Rotation</b></p>	<p><b>Left Right Case</b></p>  <p><b>Left Rotation</b></p>	<p><b>Right Left Case</b></p>  <p><b>Right Rotation</b></p>
<p>Right rotation</p> 		<p>Right Rotation</p> 	<p>Left Rotation</p> 
			

# AVL Trees

- Multi-rotations occur infrequently
- Rotations don't propagate far
- Larger tree  $\Rightarrow$  fewer rotations
- Same for other height-balanced trees
- Non-balanced trees **average**  $O(\log n)$  height



# Self-Adjusting Trees



# Tree Traversal

- **Pre-order:**

1. process node
2. visit children

⇒ c b a e d f

- **Post-order:**

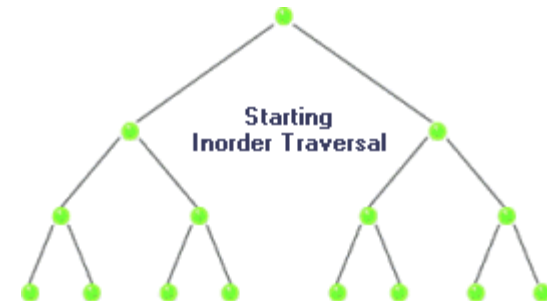
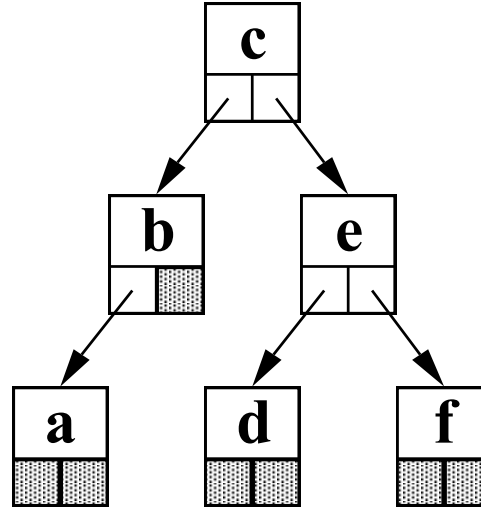
1. visit children
2. process node

⇒ a b d f e c

- **In-order:**

1. visit left-child
2. process node
3. visit right-child

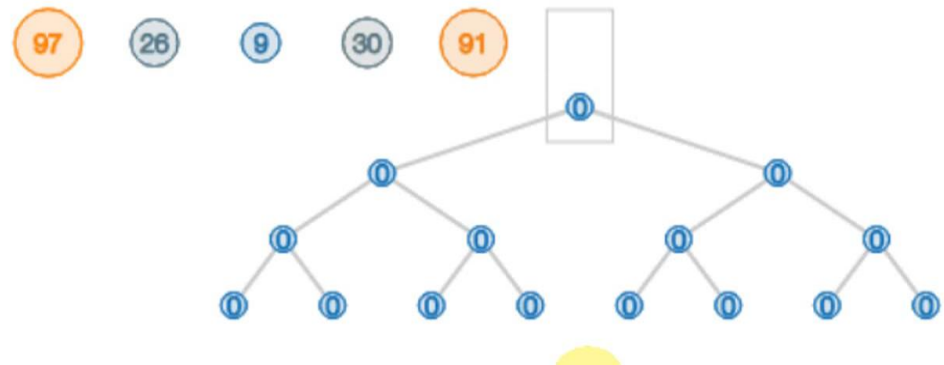
⇒ a b c d e f



# Heaps

- A tree where all of each node's children have larger / smaller "keys"
- Can be implemented using binary tree or array
- Operations:
  - Find min/max:  $O(1)$  time
  - **Add**:  $O(\log n)$  time
  - **Delete**:  $O(\log n)$  time
  - **Search**:  $O(n)$  time

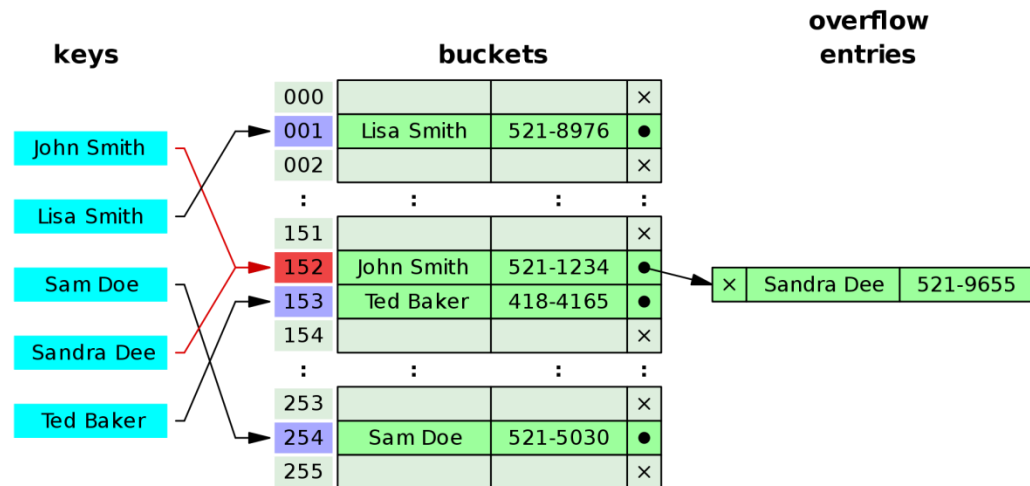
6 5 3 1 8 7 2 4





# Hash Tables

- Direct access
- Hash function
- **Collision** resolution:
  - Chaining
  - Linear probing
  - Double hashing
- Universal hashing
- $O(1)$  **average** access
- $O(n)$  worst-case access



Q: Improve **worst-case** access to  $O(\log n)$ ?

# 3.4 LINEAR PROBING HASH TABLE DEMO



[click to begin demo](#)