

# **Data Structures and Algorithms**

**Session 17. March 30, 2009**

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# Announcements

- \* Homework 4 due next Monday
- \* I have old hw's and midterms in my office

# Review

- \* Finished Huffman optimality proof sketch
- \* Hash Tables ADT
  - \*  $O(1)$  insert and search
  - \* Use hash function to determine table index
  - \* Collision resolution strategies:
    - \* Separate Chaining, Probing

# Double Hashing Example

\*  $N = 7$



\*  $h_1(x) = x \bmod 7$ ,  $h_2(x) = 5 - x \bmod 5$

\* insert 9



\* insert 16



\* insert 2



# Today's Plan

- \* Loose ends re: hashing
  - \* Rehashing
  - \* String hash function example
- \* Graphs
  - \* Definitions, implementation

# Rehashing

- \* Like ArrayLists, we have to guess the number of elements we need to insert into a hash table
- \* Whatever our collision policy is, the hash table becomes inefficient when load factor is too high.
- \* To alleviate load, **rehash**:
  - \* create larger table, scan current table, insert items into new table using new hash function

# When to Rehash

- \* For quadratic probing, insert may fail if load  $> 1/2$ 
  - \* We can rehash as soon as load  $> 1/2$
  - \* Or, we can rehash only when insert fails
- \* Heuristically choose a load factor threshold, rehash when threshold breached

# Rehash Example

\* Current Table:

0	8	7	17	25		
0	1	2	3	4	5	6

\* quad. probing with  $h(x) = (x \bmod 7)$   
8, 0, 25, 17, 7

\* New table

\*  $h(x) = (x \bmod 17)$

0	17						7	8	25							
0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16



# Rehash Cost

- \* No profound algorithm: re-insert each item
- \* Linear time
- \* If you rehash, inserting  $N$  items costs  $O(1)*N + O(N) = O(N)$
- \* Insert still costs  $O(1)$  amortized

# Hashing a String

- \* Simple but bad  $h(x)$ 
  - \* add up all the character codes (ASCII/Unicode)
- \* ASCII 'a' is 97
- \* If keys are lowercase 5 character words,  $h(x) > 485$

# Hashing a String II

- \* Weiss: Treat first 3 characters of a string as a 3 digit, base 27 number
- \* Once again, 'a' is 97, 'A' is 65

# String.hashCode()

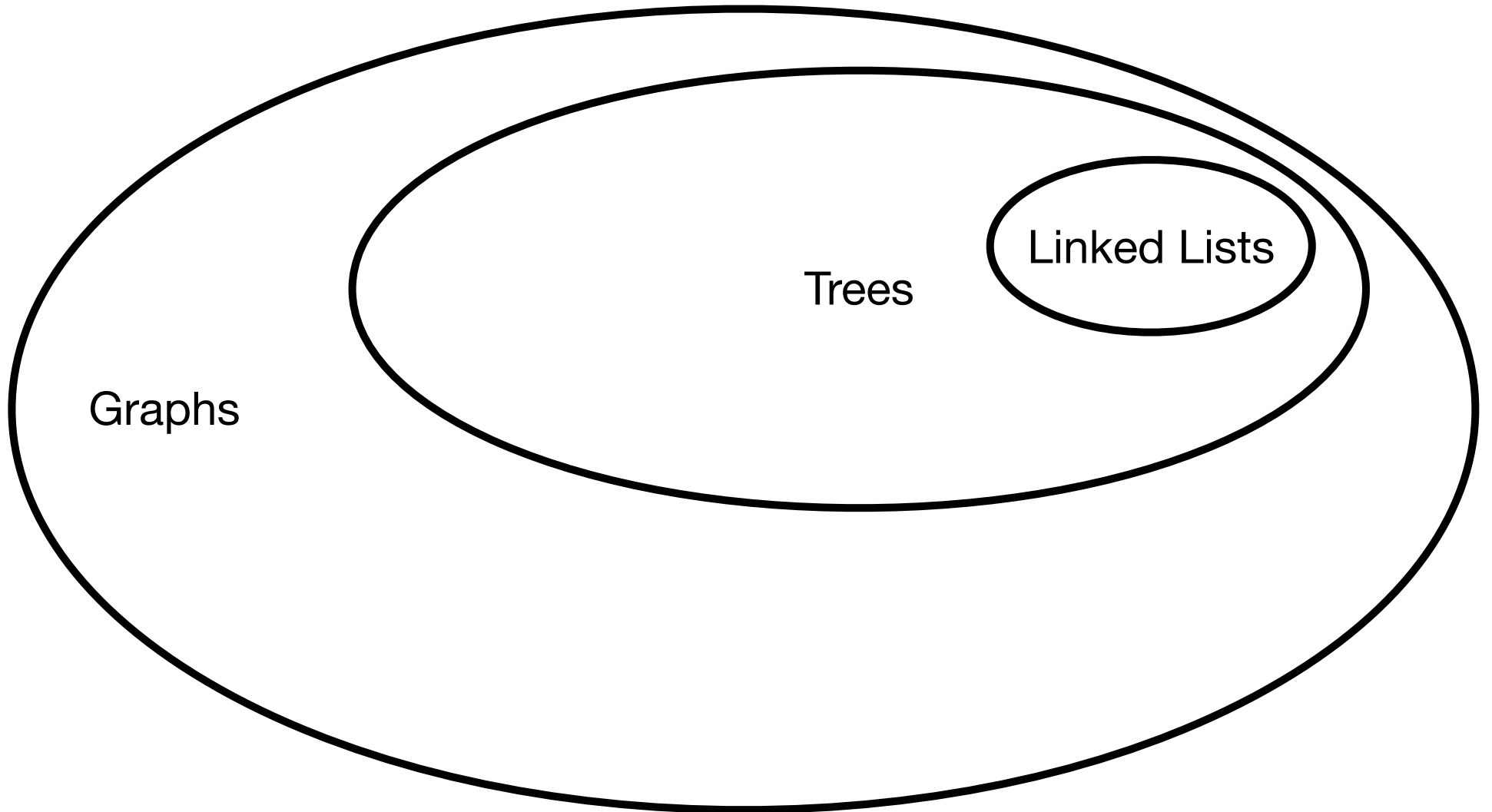
- \* Java's built in String hashCode() method

- \*  $s[0]*31^{(n-1)} + s[1]*31^{(n-2)} + \dots + s[n-1]$

- \* nth degree polynomial of base 31

- \* String characters are coefficients

# Graphs

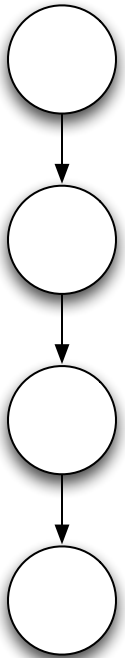


Graphs

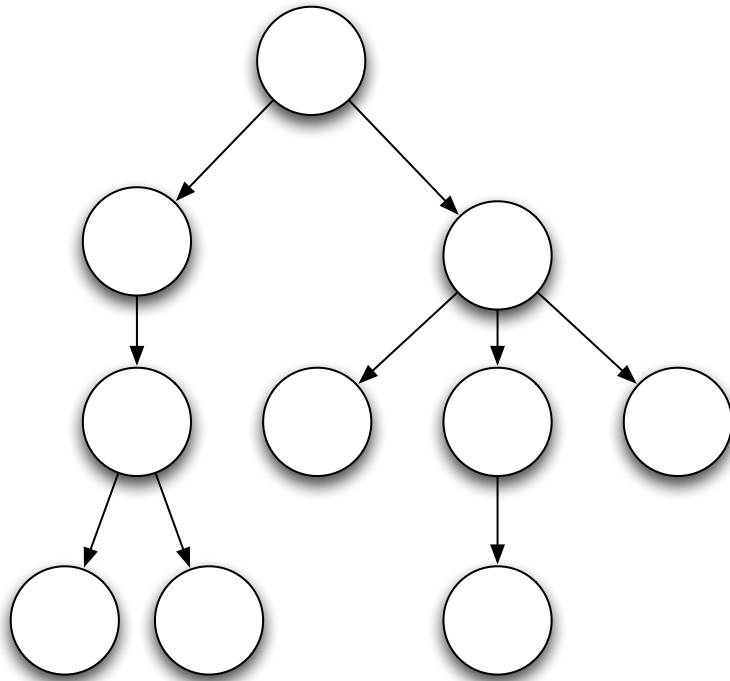
Trees

Linked Lists

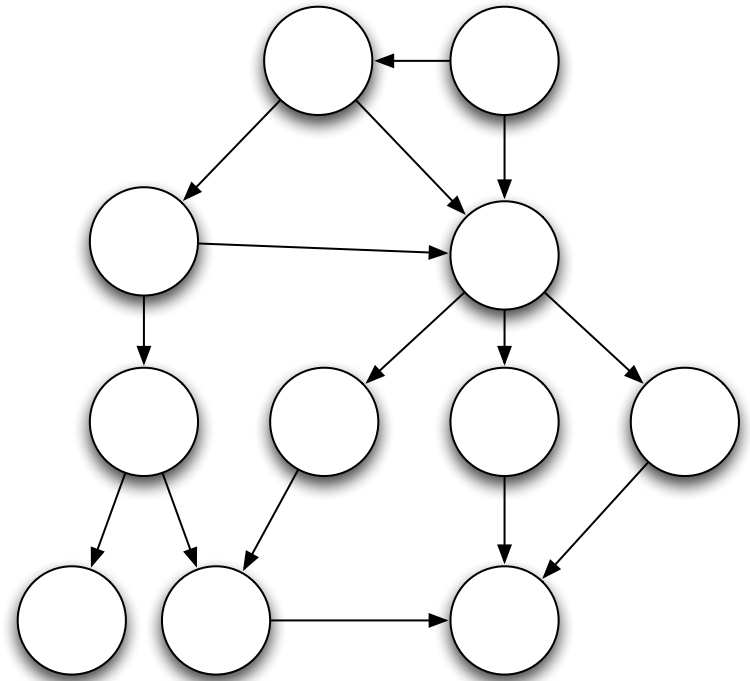
# Graphs



**LINKED  
LIST**



**TREE**



**GRAPH**

# Graph Terminology

- \* A **graph** is a set of **nodes** and **edges**
  - \* nodes aka vertices
  - \* edges aka arcs, links
- \* Edges exist between pairs of nodes
  - \* if nodes  $x$  and  $y$  share an edge, they are **adjacent**

# Graph Terminology

- \* Edges may have **weights** associated with them
- \* Edges may be **directed** or **undirected**
- \* A **path** is a series of adjacent vertices
  - \* the **length** of a path is the sum of the edge weights along the path (1 if unweighted)
- \* A **cycle** is a path that starts and ends on a node



# Graph Properties

- \* An undirected graph with no cycles is a tree
- \* A directed graph with no cycles is a special class called a **directed acyclic graph (DAG)**
- \* In a **connected** graph, a path exists between every pair of vertices
- \* A **complete** graph has an edge between every pair of vertices

# Graph Applications: A few examples

- \* Computer networks
- \* The World Wide Web
- \* Social networks
- \* Public transportation
- \* Probabilistic Inference
- \* Flow Charts

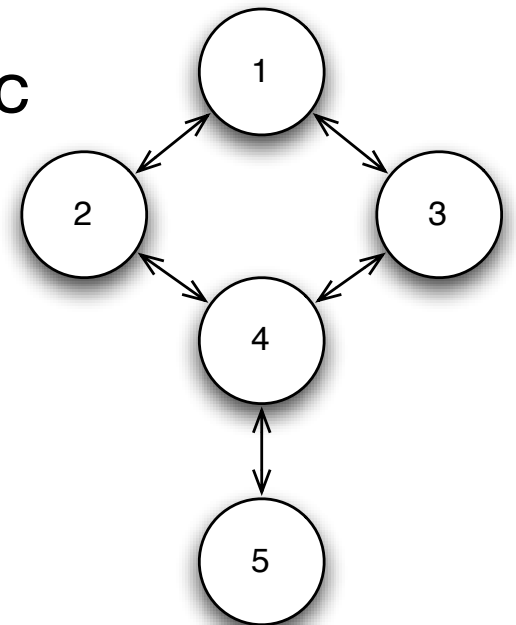
# Implementation

- \* Option 1:
  - \* Store all nodes in an indexed list
  - \* Represent edges with **adjacency matrix**
- \* Option 2:
  - \* Explicitly store **adjacency lists**

# Adjacency Matrices

- \* 2d-array **A** of boolean variables
- \*  $A[i][j]$  is true when node **i** is adjacent to node **j**
- \* If graph is undirected, **A** is symmetric

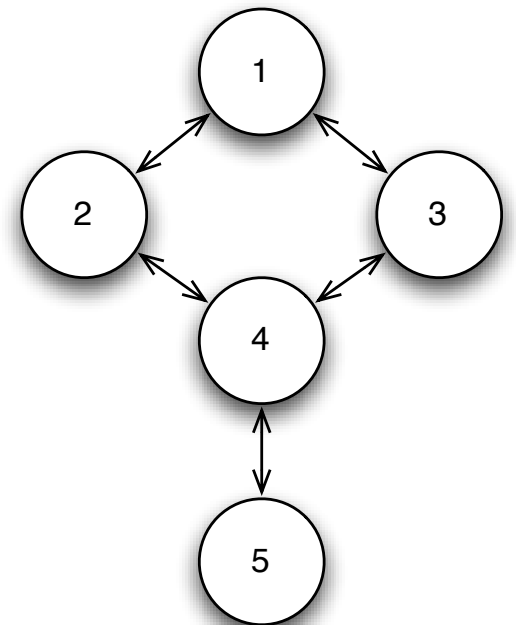
	1	2	3	4	5
1	0	1	1	0	0
2	1	0	0	1	0
3	1	0	0	1	0
4	0	1	1	0	1
5	0	0	0	1	0



# Adjacency Lists

- ✱ Each node stores references to its neighbors

1	2	3		
2	1	4		
3	1	4		
4	2	3	5	
5	4			



# Reading

- \* Homework 4
  - \* Weiss Section 5 (Hashing)
- \* Weiss Section 9.1-9.2