

GRAPHS

Lecture 17

CS 2110 — Spring 2019

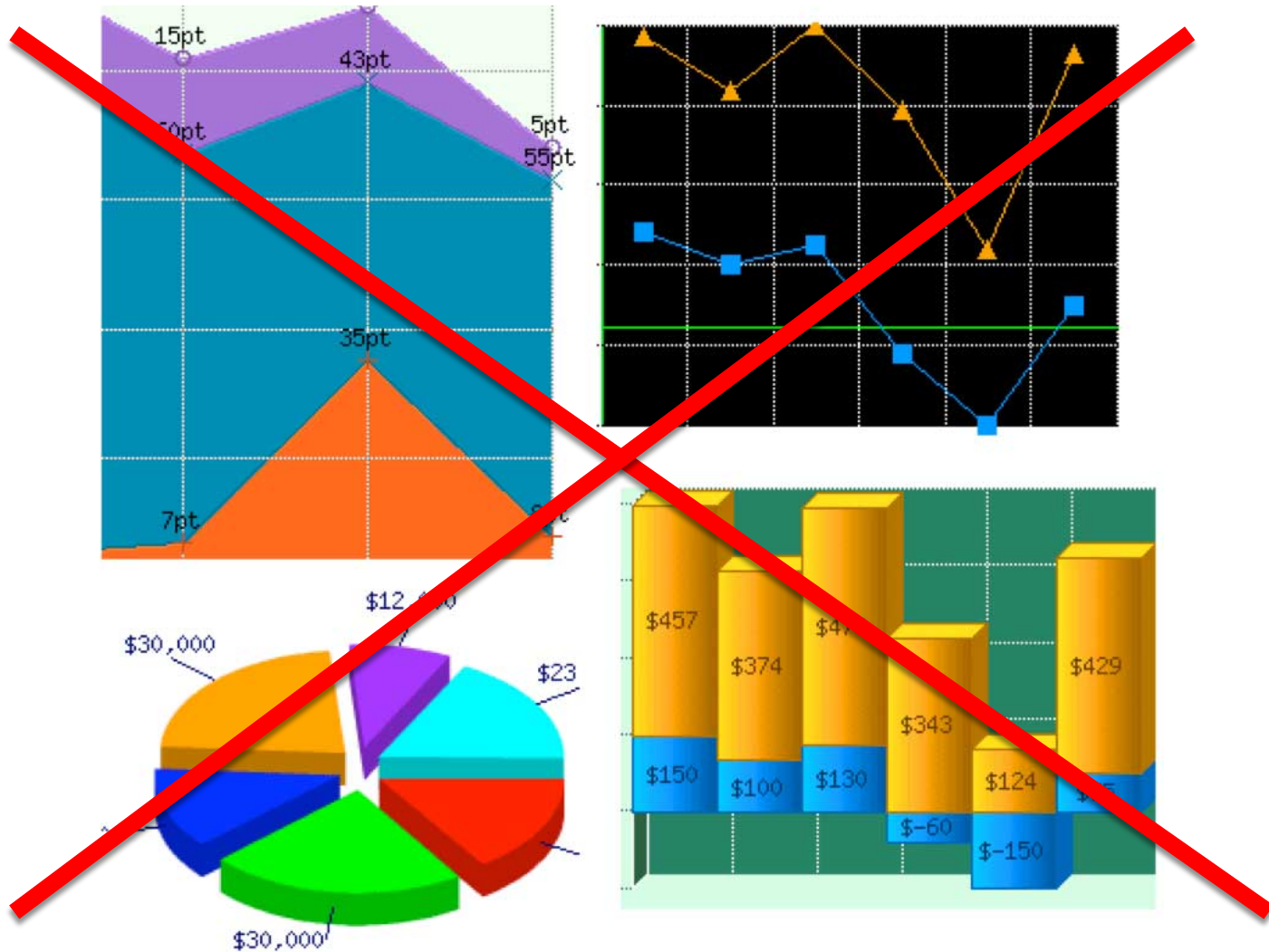
JavaHyperText Topics

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“Graphs”, topics 1-3

- 1: Graph definitions
- 2: Graph terminology
- 3: Graph representations

Charts (aka graphs)



Graphs

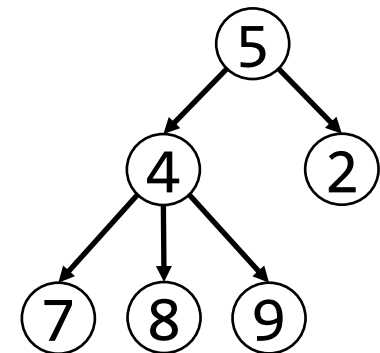
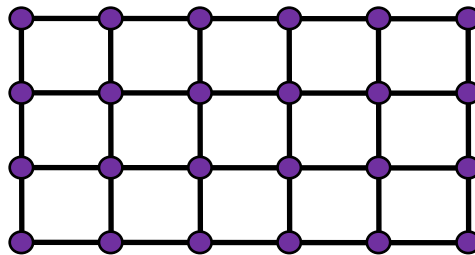
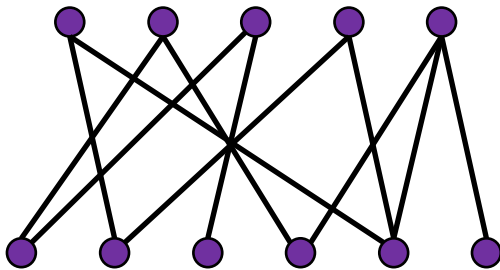
□ Graph:

- [charts] **Points** connected by **curves**

- [in CS] **Vertices** connected by **edges**

- Graphs generalize trees

- Graphs are relevant far beyond CS...examples...



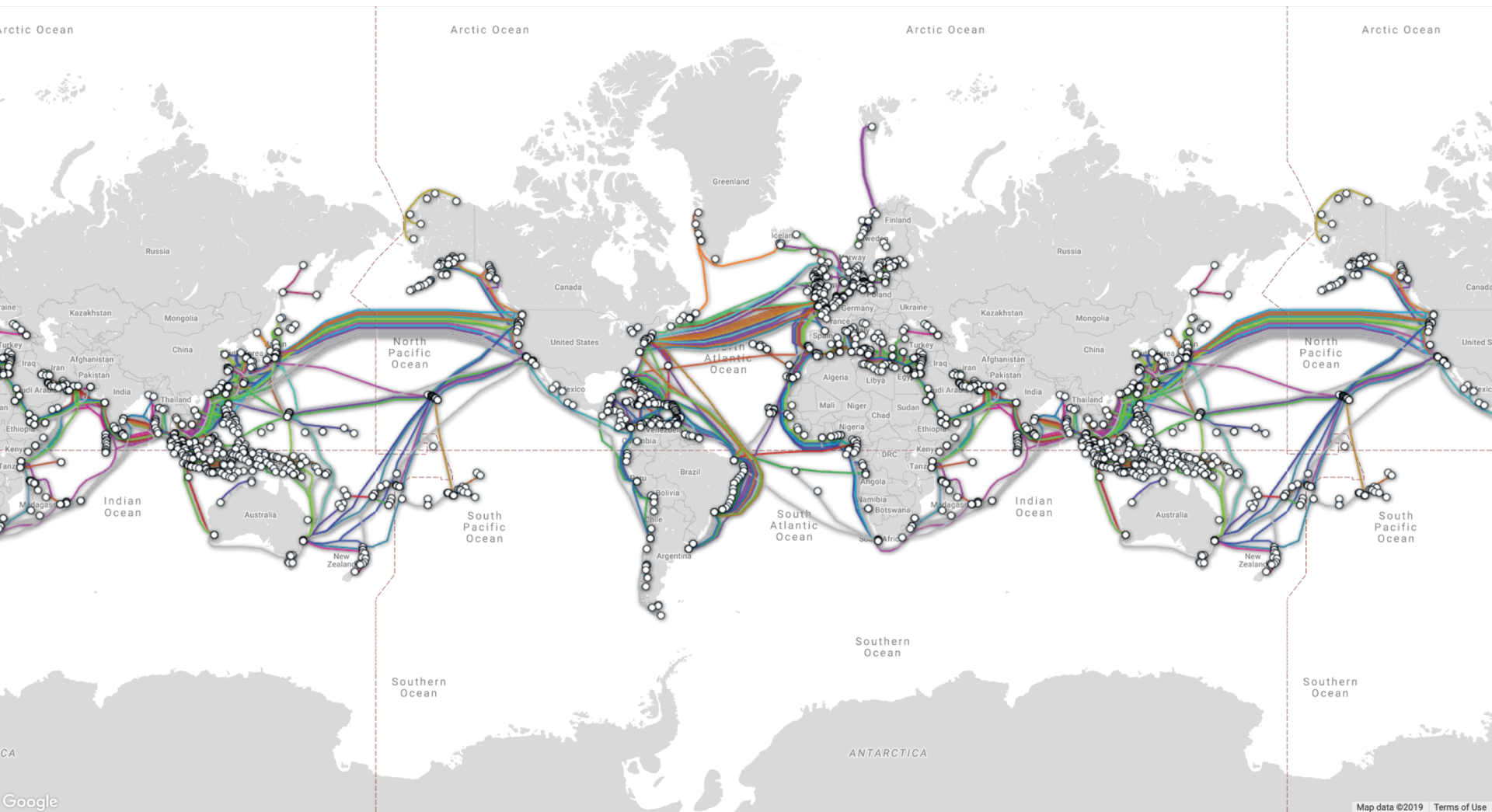


<https://medium.com/@johnrobb/facebook-the-complete-social-graph-b58157ee6594>

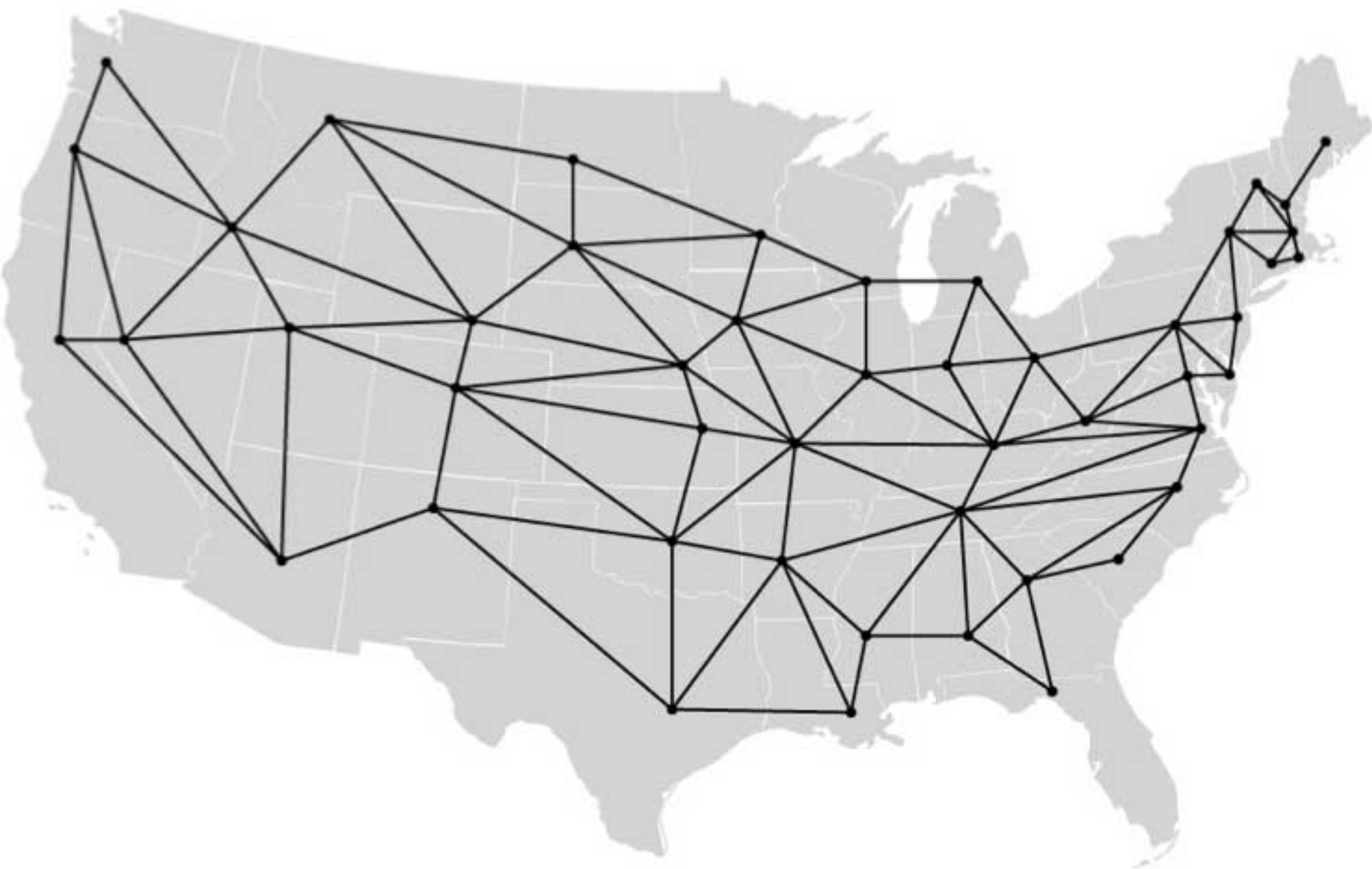
Vertices: people “from”
Edges: friendships



Vertices: subway stops
Edges: railways



Vertices: stations
Edges: cables



<http://www.cs.cmu.edu/~bryant/boolean/maps.html>

Vertices: State capitals
Edges: "States have shared border"

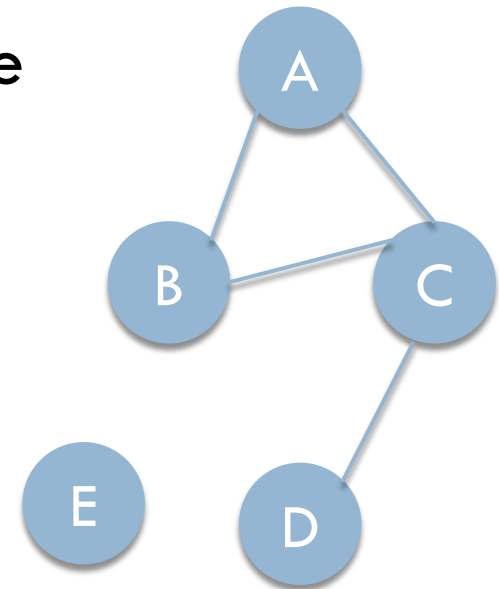
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Graphs as mathematical structures

Undirected graphs

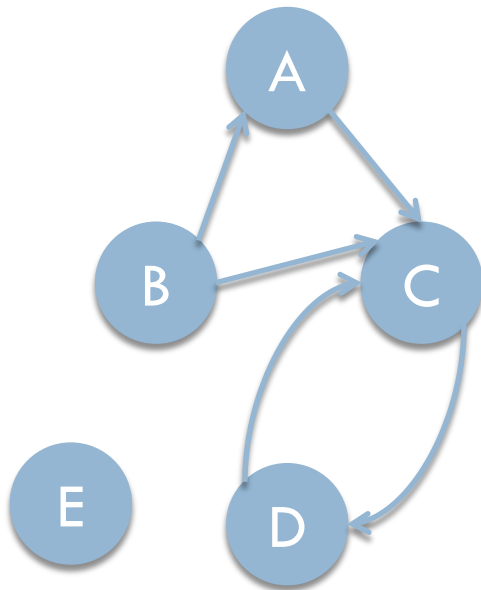
An **undirected** graph is a pair (V, E) where

- V is a set
 - ▣ Element of V is called a **vertex** or **node**
 - ▣ We'll consider only finite graphs
 - ▣ Ex: $V = \{A, B, C, D, E\}$; $|V| = 5$
- E is a set
 - ▣ Element of E is called an **edge** or **arc**
 - ▣ An edge is itself a two-element set $\{u, v\}$ where $\{u, v\} \subseteq V$
 - ▣ Often require $u \neq v$ (i.e., no **self-loops**)
 - ▣ Ex: $E = \{\{A, B\}, \{A, C\}, \{B, C\}, \{C, D\}\}$, $|E| = 4$



Directed graphs

A **directed** graph is similar except the edges are **pairs** (u, v) , hence order matters



$$V = \{A, B, C, D, E\}$$

$$E = \{(A, C), (B, A), (B, C), (C, D), (D, C)\}$$

$$|V| = 5$$

$$|E| = 5$$

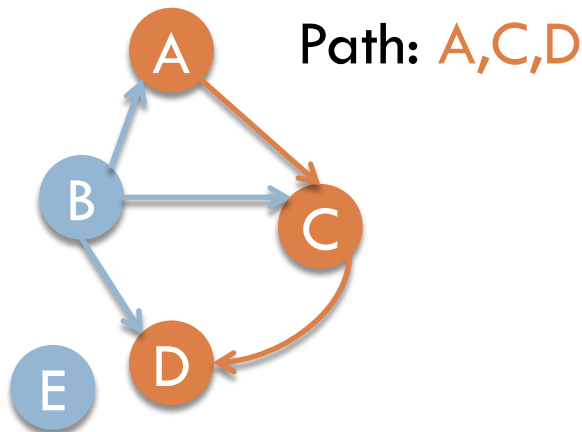
Convert undirected \leftrightarrow directed?

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- Right question is: convert and maintain which properties of graph?
- Convert undirected to directed and maintain paths?

Paths

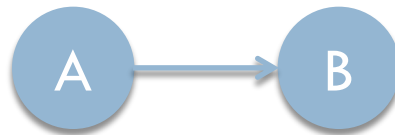
- A **path** is a sequence $v_0, v_1, v_2, \dots, v_p$ of vertices such that for $0 \leq i < p$,
 - ▣ Directed: $(v_i, v_{i+1}) \in E$
 - ▣ Undirected: $\{v_i, v_{i+1}\} \in E$
- The **length** of a path is its number of edges



Convert undirected \leftrightarrow directed?

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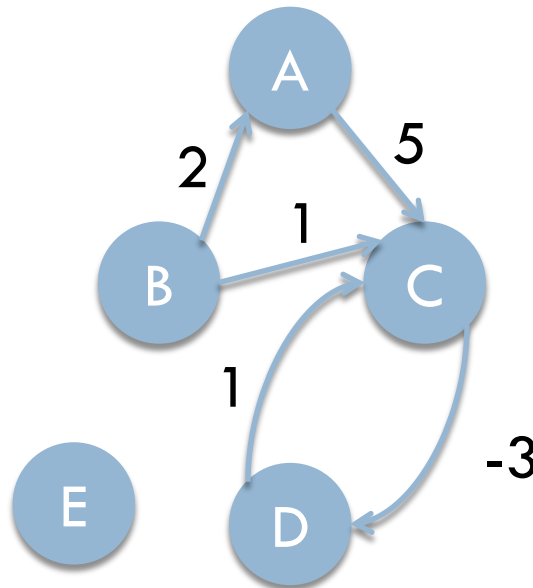
- Right question is: convert and **maintain which properties of graph?**
- Convert **undirected to directed** and maintain **paths**:
 - ▣ Nodes unchanged
 - ▣ Replace each edge $\{u,v\}$ with two edges $\{(u,v), (v,u)\}$
- Convert **directed to undirected** and maintain paths:
Can't:



Labels

Whether directed or undirected, edges and vertices can be **labeled** with additional data

Nodes already
labeled with
characters

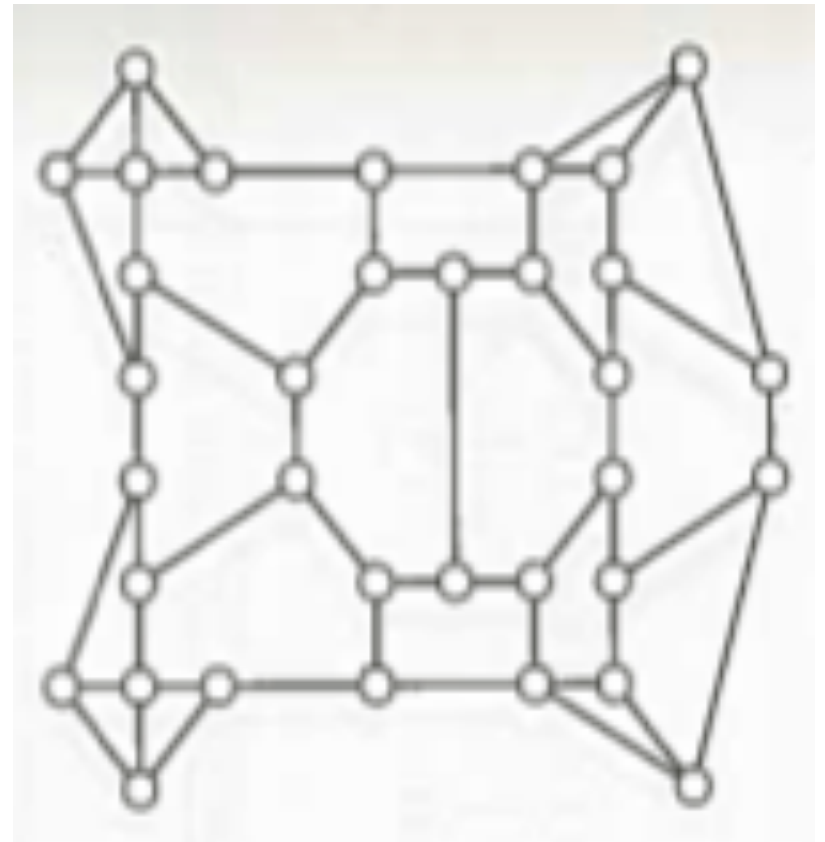
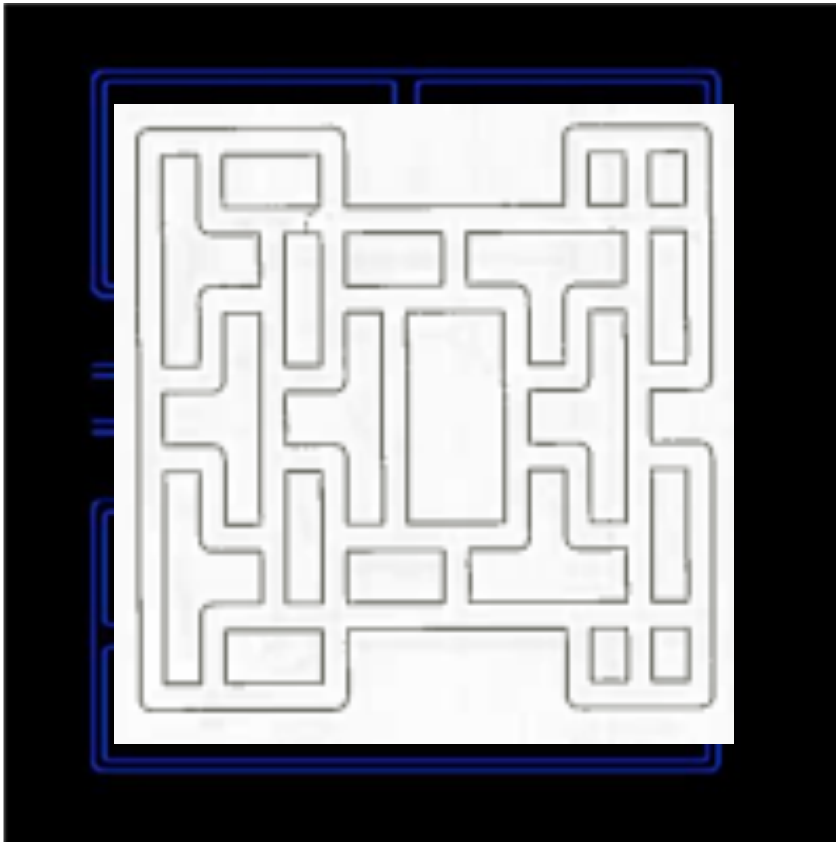


Edges now
labeled with
integers

Discuss

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How could you represent a maze as a graph?



Algorithms, 2nd ed., Sedgewick, 1988

Announcement

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A4: See time distribution and comments @735

- Spending > 16 hours is a problem; talk to us or a TA about why that might be happening
- Comments on the GUI:
 - ▣ “GUI was pretty awesome.”
 - ▣ “I didn't see the relevance of the GUI.”
- Hints:
 - ▣ “Hints were extremely useful and I would've been lost without them.”
 - ▣ “Hints are too helpful. You should leave more for people to figure out on their own.”
- Adjectives:
 - ▣ “Fun” (x30), “Cool” (x19)
 - ▣ “Whack”, “Stressful”, “Tedious”, “Rough”

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Graphs as data structures

Graph ADT

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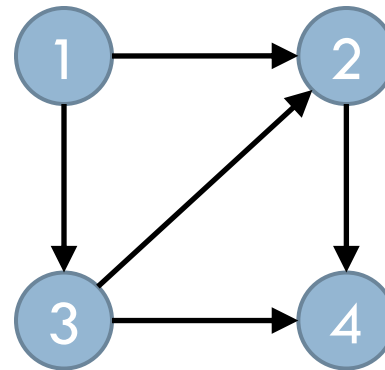
Operations could include:

- Add a vertex
- Remove a vertex
- Search for a vertex
- Number of vertices
- Add an edge
- Remove an edge
- Search for an edge
- Number of edges

Graph representations

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- Two vertices are **adjacent** if they are connected by an edge
- Common graph representations:
 - ▣ **Adjacency list**
 - ▣ **Adjacency matrix**



*running example
(directed, no edge labels)*

Adjacency “list”

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- Maintain a collection of the vertices
- For each vertex, also maintain a collection of its adjacent vertices

- Vertices: 1, 2, 3, 4

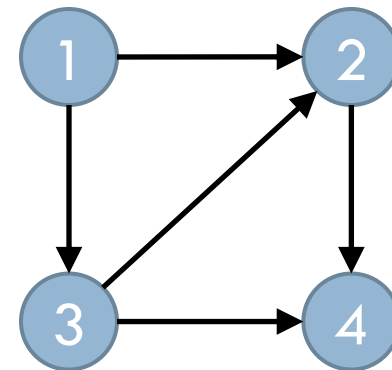
- Adjacencies:

- 1: 2, 3

- 2: 4

- 3: 2, 4

- 4: none



Could implement these “lists” in many ways...

Adjacency list implementation #1

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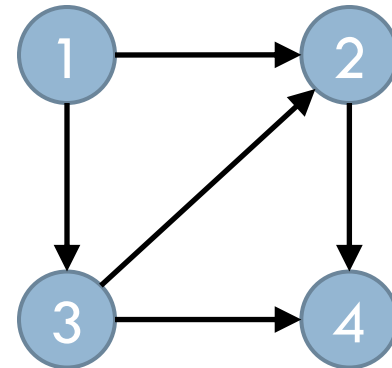
Map from vertex label to sets of vertex labels

1 \mapsto {2, 3}

2 \mapsto {4}

3 \mapsto {2, 4}

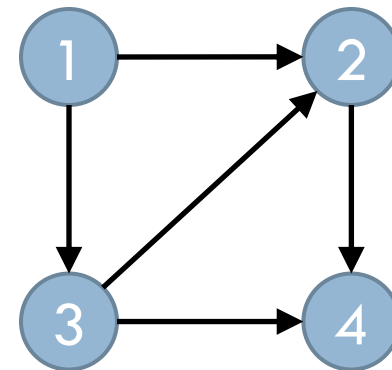
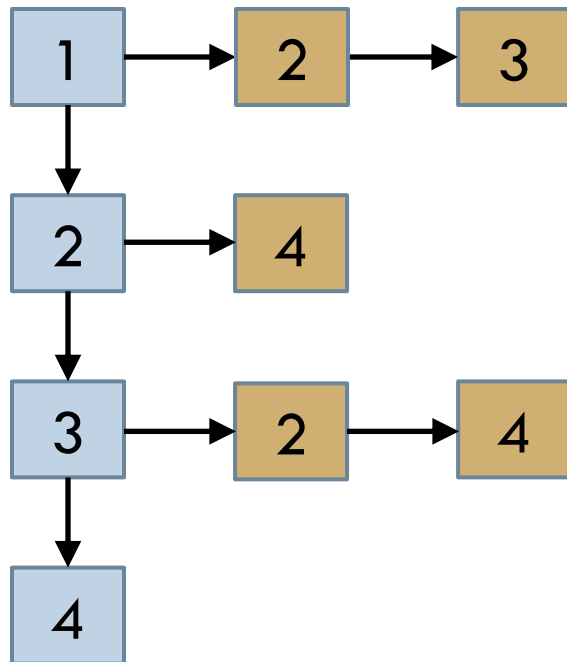
4 \mapsto {none}



Adjacency list implementation #2

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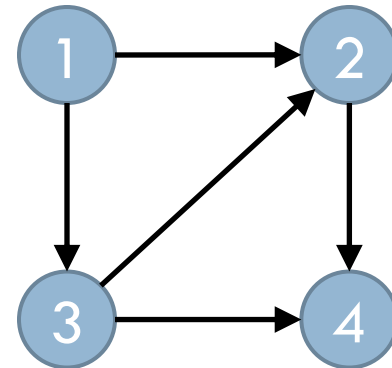
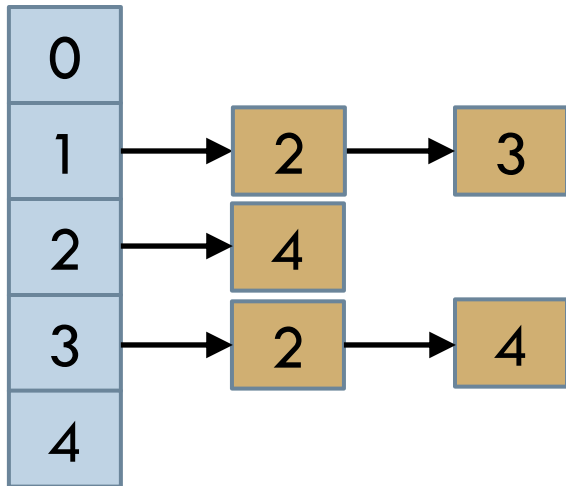
Linked list, where each node contains vertex label and **linked list** of adjacent vertex labels



Adjacency list implementation #3

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Array, where each element contains **linked list** of adjacent vertex labels



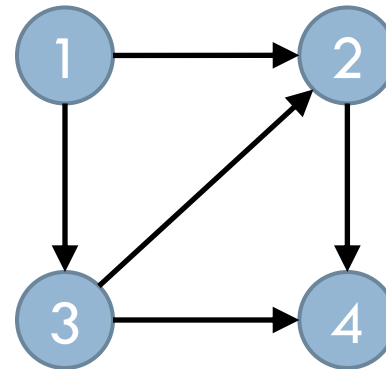
Requires: labels are integers; dealing with bounded number of vertices

Adjacency “matrix”

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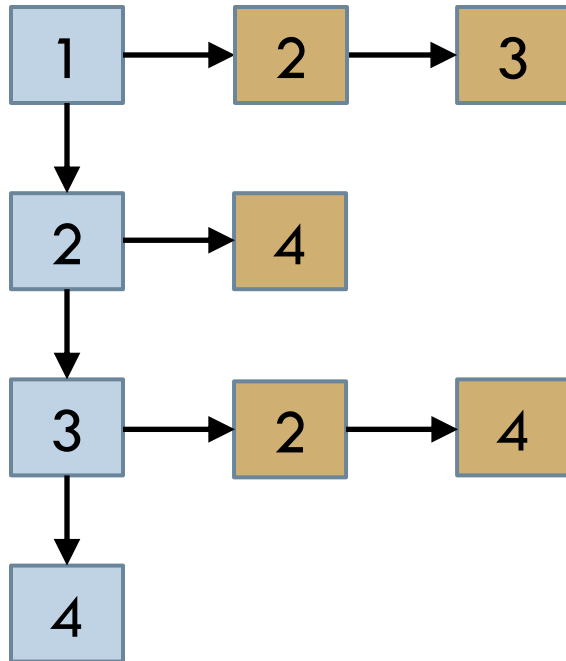
- Given integer labels and bounded # of vertices...
- Maintain a 2D Boolean array **b**
- Invariant: element **b[i][j]** is **true** iff there is an edge from vertex **i** to vertex **j**

	0	1	2	3	4
0	F	F	F	F	F
1	F	F	T	T	F
2	F	F	F	F	T
3	F	F	T	F	T
4	F	F	F	F	F



Adjacency list vs. Adjacency matrix

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	0	1	2	3	4
0	F	F	F	F	F
1	F	F	T	T	F
2	F	F	F	F	T
3	F	F	T	F	T
4	F	F	F	F	F

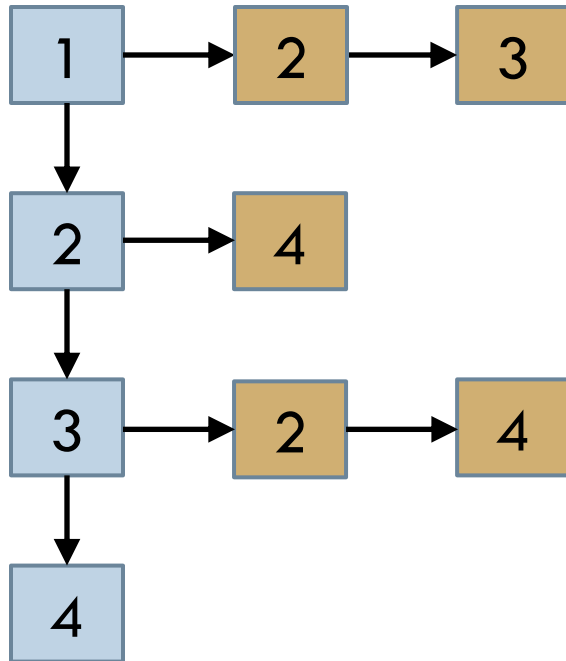
Efficiency: Space to store?

$$O(|V| + |E|)$$

$$O(|V|^2)$$

Adjacency list vs. Adjacency matrix

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	0	1	2	3	4
0	F	F	F	F	F
1	F	F	T	T	F
2	F	F	F	F	T
3	F	F	T	F	T
4	F	F	F	F	F

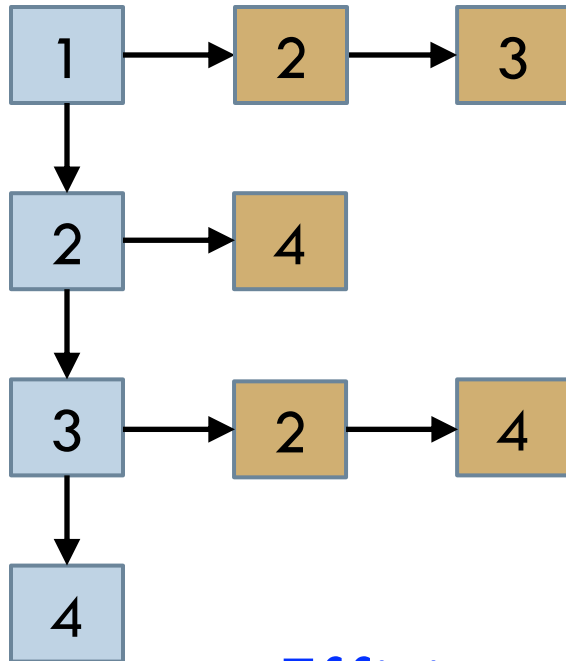
Efficiency: Time to visit all edges?

$$O(|V| + |E|)$$

$$O(|V|^2)$$

Adjacency list vs. Adjacency matrix

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	0	1	2	3	4
0	F	F	F	F	F
1	F	F	T	T	F
2	F	F	F	F	T
3	F	F	T	F	T
4	F	F	F	F	F

Efficiency: Time to determine whether edge from v_1 to v_2 exists?

$$O(|V| + |E|)$$

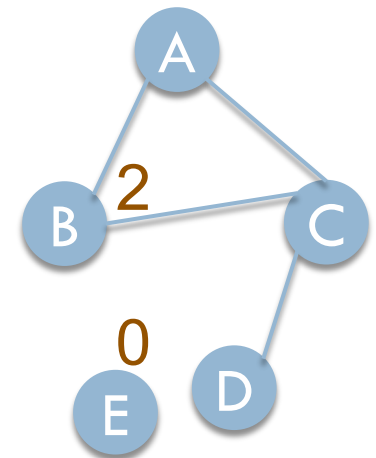
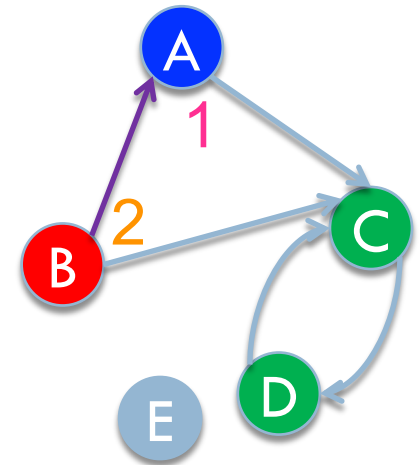
$O(1)$

Tighter: $O(|V| + \# \text{ edges leaving } v_1)$

More graph terminology

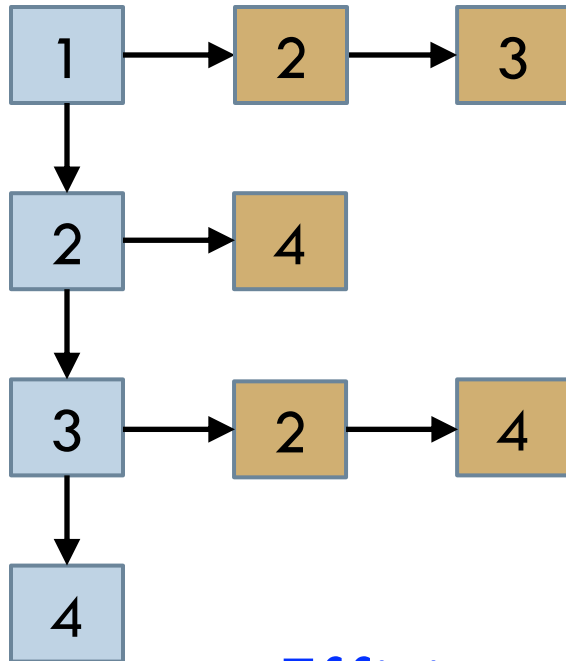
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- Vertices u and v are called
 - ▣ the **source** and **sink** of the **directed edge** (u, v) , respectively
 - ▣ the **endpoints** of (u, v) or $\{u, v\}$
- The **outdegree** of a vertex u in a directed graph is the number of edges for which u is the source
- The **indegree** of a vertex v in a directed graph is the number of edges for which v is the sink
- The **degree** of a vertex u in an undirected graph is the number of edges of which u is an endpoint



Adjacency list vs. Adjacency matrix

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	0	1	2	3	4
0	F	F	F	F	F
1	F	F	T	T	F
2	F	F	F	F	T
3	F	F	T	F	T
4	F	F	F	F	F

Efficiency: Time to determine whether
edge from v_1 to v_2 exists?

$$O(|V| + |E|)$$

$$O(1)$$

Tighter: $O(|V| + \text{outdegree}(v_1))$

Adjacency list vs. Adjacency matrix

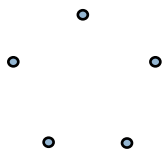
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List	Property	Matrix
$O(V + E)$	Space	$O(V ^2)$
$O(V + E)$	Time to visit all edges	$O(V ^2)$
$O(V + \text{od}(v_1))$	Time to find edge (v_1, v_2)	$O(1)$

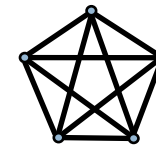
Adjacency list vs. Adjacency matrix

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List	Property	Matrix
$O(V + E)$	Space	$O(V ^2)$
$O(V + E)$	Time to visit all edges	$O(V ^2)$
$O(V + \text{od}(v_1))$	Time to find edge (v_1, v_2)	$O(1)$



Sparse



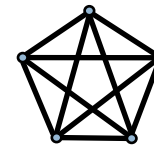
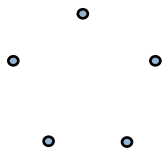
Max # edges
 $= |V|^2$

Dense

Adjacency list vs. Adjacency matrix

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List	Property	Matrix
$O(V + E)$	Space	$O(V ^2)$
$O(V + E)$	Time to visit all edges	$O(V ^2)$
$O(V + \text{od}(v_1))$	Time to find edge (v_1, v_2)	$O(1)$



Max # edges
 $= |V|^2$

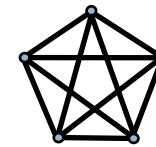
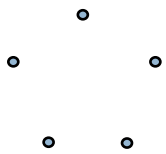
Sparse: $|E| \ll |V|^2$

Dense: $|E| \approx |V|^2$

Adjacency list vs. Adjacency matrix

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List	Property	Matrix
$O(V + E)$	Space	$O(V ^2)$
$O(V + E)$	Time to visit all edges	$O(V ^2)$
$O(V + \text{od}(v_1))$	Time to find edge (v_1, v_2)	$O(1)$
Sparse graphs	Better for	Dense graphs



Max # edges
 $= |V|^2$

Sparse: $|E| \ll |V|^2$

Dense: $|E| \approx |V|^2$