## Graphs and their representations

EECS 214, Fall 2018

Kinds of graphs

A graph (undirected)


$$
\begin{aligned}
G= & (V, E) \\
V= & \{a, b, c, d, e, f, g, h, i, j, k, \ell\} \\
E= & \{\{a, b\},\{a, c\},\{a, d\},\{a, f\},\{b, d\},\{c, f\}, \\
& \{c, h\},\{c, j\},\{d, g\},\{e, g\},\{e, i\},\{e, m\}, \\
& \{f, g\},\{f, j\},\{g, j\},\{g, k\},\{h, i\},\{h, j\},\{i, j\}\}
\end{aligned}
$$

A directed graph


$$
\begin{aligned}
& G=(V, E) \\
& V=\{a, b, c, d, e, f\} \\
& E=\{(a, b),(b, c),(c, d),(c, f),(d, d),(d, e),(e, f),(f, e)\}
\end{aligned}
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## A directed graph with cycles



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A DAG (directed acyclic graph)


A weighted, directed graph


$$
\begin{aligned}
& G=(V, E, w) \\
& V=\{a, b, c, d, e, f\} \\
& E=\{(a, b),(b, c),(c, d),(c, f),(d, d),(d, e),(e, f),(f, e)\} \\
& w=\{(a, b) \mapsto 1,(b, c) \mapsto 2,(c, d) \mapsto 1,(c, f) \mapsto 12, \ldots\}
\end{aligned}
$$

A little graph theory

## Some graph definitions



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If $\{v, u\} \in E$ then $v$ and $u$ are adjacent

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If $\left\{\boldsymbol{v}_{0}, \boldsymbol{v}_{1}\right\},\left\{\boldsymbol{v}_{1}, \boldsymbol{v}_{2}\right\}, \ldots,\left\{\boldsymbol{v}_{k-1}, \boldsymbol{v}_{k}\right\} \in E$ then there is a path from $v_{0}$ to $v_{k}$, and we say $v_{0}$ and $v_{k}$ are connected

## Components



A subgraph of nodes all connected to each other is a connected component; here we have two

## Degree

The degree of a vertex is the number of adjacent vertices:

$$
\operatorname{degree}(v, G)=|\{u \in V:\{u, v\} \in E\}| \text { where } G=(V, E)
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Sometimes we will refer to the degree as $d$, such as when we say that a particular operation is $\mathcal{O}(d)$.

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If $v_{k}$ and $v_{0}$ are mutually reachable from each other, they are strongly connected

## Strongly connected components



In a digraph, a subgraph of vertices all strongly connected to each other is a strongly connected component; here we have a connected graph with two SCCs

Dense versus sparse


Programming with graphs

## A graph ADT

Looks like ( $V, E$ ) (as above)
Operations:
interface GRAPH:
def new_vertex(self) -> nat? def add_edge(self, u: nat?, v: nat?) -> VoidC def has_edge?(self, u: nat?, v: nat?) -> bool? def get_vertices(self) -> VertexSet def get_neighbors(self, v: nat?) -> VertexSet

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Invariants:

- $V=\{0,1, \ldots,|V|-1\}$
- $\bigcup E \subseteq V$


## Graph ADT laws

1. $\{g=(V, E)\}$ g.new_vertex ()$=n\{g=(V \cup\{n\}, E)\}$ where $n=\max (V)+1$
2. $\{g=(V, E) \wedge n, m \in V\}$ g.add_edge $(n, m)\{g=$ $(V, E \cup\{\{n, m\}\})\}$
3. $\{g=(V, E) \wedge\{n, m\} \in E\}$ g.has_edge? $(n, m)=T$
4. $\{g=(V, E) \wedge\{n, m\} \notin E\}$ g.has_edge? $(n, m)=\perp$
5. $\{g=(V, E)\}$ g.get_vertices ()$=V$
6. $\{g=(V, E)\}$ g.get_neighbors $(n)=\{m \in V:\{m, n\} \in E\}$

## A digraph ADT

Looks like ( $V, E$ ) (as above, $E$ contains ordered pairs of vertices)

## Operations:

interface DIGRAPH: def new_vertex(self) -> nat? def add_edge(self, src: nat?, dst: nat?) -> VoidC def has_edge?(self, src: nat?, dst: nat?) -> bool? def get_vertices(self) -> VertexSet def get_succs(self, v: nat?) -> VertexSet def get_preds(self, v: nat?) -> VertexSet

Invariants:

- $V=\{0,1, \ldots,|V|-1\}$
- $\forall(v, u) \in E . v \in V \wedge u \in V$


## Digraph ADT laws

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5. $\{g=(V, E)\}$ g.get_vertices ()$=V$
6. $\{g=(V, E)\}$ g.get_succs $(n)=\{m \in V:(n, m) \in E\}$
7. $\{g=(V, E)\}$ g.get_preds $(n)=\{m \in V:(m, n) \in E\}$

## A weighted digraph ADT

Looks like ( $V, E, w$ ) (as above)
Operations:
let weight? = OrC(num?, inf)
interface WDIGRAPH:
def new_vertex(self) -> nat?
def set_edge(self, src: nat?, w: weight?, dst: nat?) -> VoidC
def get_edge(self, src: nat?, dst: nat?) -> weight?
def get_vertices(self) -> VertexSet
def get_succs(self, v: nat?) -> VertexSet def get_preds(self, v: nat?) -> VertexSet

## Weighted digraph ADT laws

1. $\{g=(V, E, w)\}$ g.new_vertex ()$=n\{g=(V \cup\{n\}, E, w)\}$ where $n=\max (V)+1$
2. $\{g=(V, E, w) \wedge n, m \in V\}$ g.set_edge( $n, a, m)\{g=$ $(V, E \cup\{(n, m)\}, w\{(n, m) \mapsto a\})\}$ where $a<\infty$
3. $\{g=(V, E, w) \wedge n, m \in V\}$ g.set_edge $(n, \infty, m)\{g=$ $(V, E \backslash\{(n, m)\}, w \backslash\{(n, m)\})\}$
4. $\{g=(V, E, w) \wedge(n, m) \in E\}$ g.get_edge $(n, m)=w(n, m)$
5. $\{g=(V, E, w) \wedge(n, m) \notin E\}$ g.get_edge $(n, m)=\infty$
6. $\{g=(V, E, w)\}$ g.get_vertices $(g)=V$
7. $\{g=(V, E, w)\}$ g.get_succs $(n)=\{m \in V:(n, m) \in E\}$
8. $\{g=(V, E, w)\}$ g.get_preds $(n)=\{m \in V:(m, n) \in E\}$

## Graph representation

## Two graph representations

There are two common ways that graphs are represented on a computer:

- adjacency list
- adjacency matrix

Adjacency list


In an array, store a list of neighbors (or successors) for each vertex:


## Adjacency matrix



Store a $|V|$-by- $|V|$ matrix of Booleans indicating where edges are present:


## A directed adjacency matrix example



|  | 0 | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | 0 | 1 | 0 | 0 | 0 | 0 |
| 1 | 0 | 0 | 1 | 0 | 0 | 0 |
| 2 | 0 | 0 | 0 | 1 | 0 | 1 |
| 3 | 0 | 0 | 0 | 1 | 1 | 0 |
| 4 | 1 | 0 | 0 | 0 | 0 | 1 |
| 5 | 1 | 1 | 0 | 1 | 1 | 0 |

## With weights



|  | 0 | 1 | 2 | 3 | 4 | 5 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 0 | $\infty$ | 2 | $\infty$ | $\infty$ | $\infty$ | $\infty$ |
| 1 | $\infty$ | $\infty$ | 7 | $\infty$ | $\infty$ | $\infty$ |
| 2 | $\infty$ | $\infty$ | $\infty$ | -4 | $\infty$ | 1 |
| 3 | $\infty$ | $\infty$ | $\infty$ | 10 | 8 | $\infty$ |
| 4 | 1 | $\infty$ | $\infty$ | $\infty$ | $\infty$ | 0 |
| 5 | 2 | 3 | $\infty$ | 4 | 5 | $\infty$ |

## Space comparison

Adjacency list-has a list for each vertex, and the total length of all the lists is the number of edges:
$\mathcal{O}(V+E)$
Adjacency matrix—is $|V|$ by $|V|$ regardless of the number of edges:
$\mathcal{O}\left(V^{2}\right)$

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Adjacency matrix—is $|V|$ by $|V|$ regardless of the number of edges:
$\mathcal{O}\left(V^{2}\right)$
When might we want to use one or the other?

## Time comparison



## Time comparison

|  | adj. list | adj. matrix |
| :---: | :---: | :---: |
| add_edge/set_edge | $\mathcal{O}($ setlnsert $(d))$ | $\mathcal{O}(1)$ |

## Time comparison



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|  | adj. list | adj. matrix |
| :---: | :---: | :---: |
| add_edge/set_edge | $\mathcal{O}($ setlnsert(d)) | $\mathcal{O}(1)$ |
| get_edge/has_edge? | $\mathcal{O}($ setLookup(d) $)$ | $\mathcal{O}(1)$ |

## Time comparison

|  | adj. list | adj. matrix |
| :---: | :---: | :---: |
| add_edge/set_edge | $\mathcal{O}($ setInsert $(d))$ | $\mathcal{O}(1)$ |
| get_edge/has_edge? | $\mathcal{O}($ setLookup $(d))$ | $\mathcal{O}(1)$ |
| get_succs |  |  |

## Time comparison

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| add_edge/set_edge | $\mathcal{O}($ setInsert $(d))$ | $\mathcal{O}(1)$ |
| get_edge/has_edge? | $\mathcal{O}($ setLookup $(d))$ | $\mathcal{O}(1)$ |
| get_succs | $\mathcal{O}(\mid$ Result $\mid)$ | $\mathcal{O}(V)$ |

## Time comparison



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|  | adj. list | adj. matrix |
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| get_succs | $\mathcal{O}(\mid$ Result $\mid)$ | $\mathcal{O}(V)$ |
| get_preds | $\mathcal{O}(V+E)$ | $\mathcal{O}(V)$ |

Next time: exam review

