

VCU, Department of Computer Science

CMSC 302

Graphs

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A good picture is worth a thousand words

- **Expressive power** is the **first explanation** for a **success of graphs**
- More claims for graphs come later
- Example for a title above follows!

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Greek pre-Socratic Philosophers

- Thales of Miletus influenced Anaximander, Pythagoras, Heraclitus and Anaximenses of Miletus
- Anaximander infl. Pythagoras
- Pherecides of Syros infl. Pythagoras
- Anaximander infl. Heraclitus
- Pythagoras infl. Heraclitus
- Pythagoras infl. Empedocles
- Pythagoras infl. Philolaus
- Pythagoras infl. Archytas
- Pythagoras infl. Alcmaeon of Croton
- Philolaus infl. Archytas
- Heraclitus infl. Parmenides
- Parmenides infl. Democritus
- Democritus infl. Philolaus
- Parmenides infl. Melissus of Samos
- Parmenides infl. Socrates
- Leucippus infl. Democritus, (and this is about 60% of the story)

Question for you:

Did Heraclitus infl. Archytas?

Next question:

Did Pythagoras infl. Melissus of Samos?

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Greek pre-Socratic Philosophers

The diagram illustrates the influence of Greek pre-Socratic philosophers. It features four portraits: Heraclitus (top left), Archytas (top right), Melissus of Samos (bottom left), and Pythagoras (bottom right). A red arrow points from Heraclitus to Archytas, and another red arrow points from Pythagoras to Melissus of Samos. The text 'Question for you: Did Heraclitus infl. Archytas?' is positioned to the right of the Heraclitus-Archytas arrow, and 'Next question: Did Pythagoras infl. Melissus of Samos?' is positioned to the right of the Pythagoras-Melissus arrow.


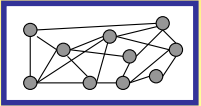
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The whole Greek Pre-Socratic Philosopher in GRAPH, and same questions for you now:
Did Heraclitus infl. Archytas? Did Pythagoras infl. Melissus of Samos?

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§ 9.1 What are Graphs?

- General meaning in everyday math: *A plot or chart of numerical data using a coordinate system.* 
- Technical meaning in **discrete mathematics**: *A particular class of discrete structures (to be defined) that is useful for representing relations and has a convenient webby-looking graphical representation.* 

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Applications of Graphs

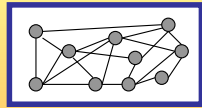
- Potentially anything (graphs can represent relations, relations can describe the extension of any predicate).
- Apps in networking, scheduling, flow optimization, circuit design, path planning.
- Geneology analysis, computer game-playing, program compilation, object-oriented design, ...

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Simple Graphs

- Correspond to **symmetric binary** relations R .
- A *simple graph* $G=(V,E)$ consists of:
 - a **set** V of vertices or *nodes* (V corresponds to the universe of the relation R),
 - a **set** E of edges (*arcs, links*): **unordered** pairs of (distinct) elements $u,v \in V$, such that uRv .

Note, in a simple graph there is only ONE EDGE between vertices & no ARROWS & no LOOPS

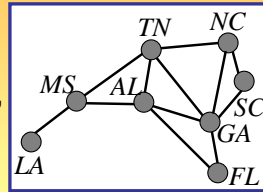


Visual Representation of a Simple Graph

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Example of a *Simple Graph*

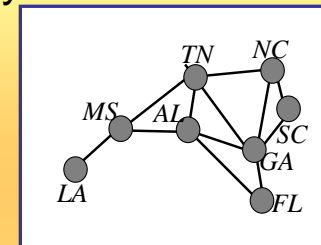
- Let V be the set of states in the southeastern U.S.:
 - $V = \{FL, GA, AL, MS, LA, SC, TN, NC\}$
- Let $E = \{\{u, v\} \mid u \text{ adjoins } v\}$
 - $E = \{\{FL, GA\}, \{FL, AL\}, \{GA, AL\}, \{GA, SC\}, \{GA, TN\}, \{GA, NC\}, \{AL, MS\}, \{AL, TN\}, \{MS, LA\}, \{MS, TN\}, \{TN, NC\}, \{NC, SC\}\}$



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Well, what's simpler and clearer in representing adjacency of SE states ?



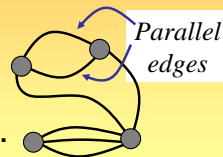
Sure, this is not bad either

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Multigraphs

- Like simple graphs, but there may be **more than one edge** connecting two given nodes.
- A *multigraph* $G=(V, E, f)$ consists of a set V of vertices, a set E of edges (as primitive objects), and a function $f: E \rightarrow \{\{u, v\} \mid u, v \in V \wedge u \neq v\}$.
- e.g., nodes are cities, edges are segments of major highways.

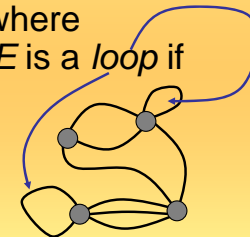


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Pseudographs

- Like a multigraph, but **edges connecting a node to itself are allowed**.
- A *pseudograph* $G=(V, E, f)$ where $f: E \rightarrow \{\{u, v\} \mid u, v \in V\}$. Edge $e \in E$ is a *loop* if $f(e) = \{u, u\} = \{u\}$.
- e.g., nodes are campsites in a state park, edges are hiking trails through the woods.

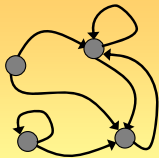


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Directed Graphs

- Correspond to arbitrary binary relations R , which need not be **symmetric**.
- A *directed graph* (V, E) consists of a set of vertices V and a binary relation E on V .
- E.g.: $V = \text{people}$,
 $E = \{(x, y) \mid x \text{ loves } y\}$

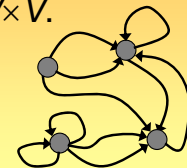


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Directed Multigraphs

- Like directed graphs, but there may be more than one arc from a node to another.
- A *directed multigraph* $G = (V, E, f)$ consists of a set V of vertices, a set E of edges, and a function $f: E \rightarrow V \times V$.
- E.g., $V = \text{web pages}$,
 $E = \text{hyperlinks}$. *The WWW is a directed multigraph...*



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Types of Graphs: Summary

- Summary of the book's definitions.
- Keep in mind this terminology is not fully standardized...

Term	Edge type	Multiple edges ok?	Self-loops ok?
Simple graph	Undir.	No	No
Multigraph	Undir.	Yes	No
Pseudograph	Undir.	Yes	Yes
Directed simple graph	Directed	No	Yes
Directed multigraph	Directed	Yes	Yes

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§ 9.2 Graph Terminology

- *adjacent, or neighboring*
- *degree,*
- *connects,*
- *endpoints,*
- *initial,*
- *terminal,*
- *in-degree,*
- *out-degree,*
- *complete,*
- *cycles,*
- *wheels,*
- *n-cubes,*
- *bipartite,*
- *subgraph,*
- *union.*

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Adjacency

Let G be an undirected graph with **edge set** E . Let $e \in E$ be (or map to) the pair $\{u, v\}$.

(Note that u and v are vertices!)

Then we say:

- u, v are *adjacent / neighbors / connected*.
- Edge e is *incident with* vertices u and v .
- Edge e *connects* u and v .
- Vertices u and v are *endpoints* of edge e .

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Degree of a Vertex

- Let G be an undirected graph, $v \in V$ a vertex.
- The **degree of v** , $\deg(v)$, is its number of incident edges. (*Except that any self-loops are counted twice.*)
- A vertex with degree 0 is *isolated*.
- A vertex of degree 1 is *pendant*.

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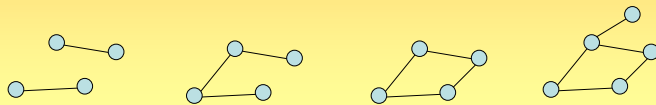
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Handshaking Theorem

- Let G be an undirected (simple, multi-, or pseudo-) graph with vertex set V and edge set E . Then

$$\sum_{v \in V} \deg(v) = 2|E|$$

- Proof: Each edge contributes twice to the degree count of all vertices
- Corollary: Any **undirected** graph has an **even** number of vertices of **odd degree**.



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Example:

If a graph has 5 vertices, can each vertex have degree 3? 4?

Solution:

- The sum is $3 \cdot 5 = 15$ which is an odd number. Not possible.

- The sum is $20 = 2 |E|$ and $20/2 = 10$. May be possible.

Question for a class: Is it possible to have a graph of 5 vertices each having degree 1?

Answer: It is not!!! (Sum of the degrees of graph is then five, and we know that it must be EVEN)

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Directed Adjacency

- Let G be a **directed** (possibly multi-) graph, and let e be an edge of G that is (or maps to) (u, v) . Then we say:
 - u is *adjacent to* v , v is *adjacent from* u
 - e comes from u , e goes to v .
 - e connects u to v , e goes from u to v
 - the *initial vertex* of e is u
 - the *terminal vertex* of e is v

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Directed Degree

- Let G be a **directed** graph, v a vertex of G .
 - The *in-degree* of v , $\deg^-(v)$, is the number of edges going to v .
 - The *out-degree* of v , $\deg^+(v)$, is the number of edges coming from v .
 - The *degree* of v , $\deg(v) \equiv \deg^-(v) + \deg^+(v)$, is the sum of v 's in-degree and out-degree.

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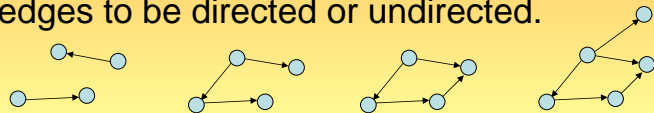
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Directed Handshaking Theorem

- Let G be a **directed** (possibly multi-) graph with vertex set V and edge set E . Then:

$$\sum_{v \in V} \deg^-(v) = \sum_{v \in V} \deg^+(v) = \frac{1}{2} \sum_{v \in V} \deg(v) = |E|$$

- Note that the **degree of a node is unchanged** by whether we consider its edges to be directed or undirected.



The visual **counting trick** here is – count the **heads** of arrows as **deg⁻** and count the **ends** of the tails as **deg⁺**

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Special Graph Structures

Special cases of **undirected** graph structures:

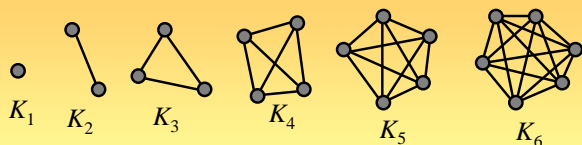
- Complete graphs K_n
- Cycles C_n
- Wheels W_n
- n -Cubes Q_n
- Bipartite graphs
- Complete bipartite graphs $K_{m,n}$

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Complete Graphs

- For any $n \in \mathbf{N}$, a *complete graph* on n vertices, K_n , is a simple graph with n nodes in which **every node is adjacent (connected) to every other node**: $\forall u, v \in V: u \neq v \leftrightarrow \{u, v\} \in E$.



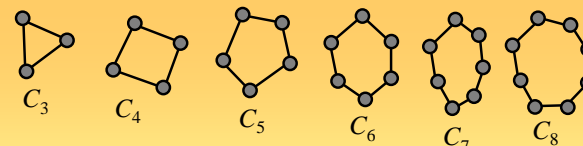
Note that K_n has $\sum_{i=1}^n i = \frac{n(n-1)}{2}$ edges.

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Cycles

- For any $n \geq 3$, a *cycle* on n vertices, C_n , is a simple graph where $V = \{v_1, v_2, \dots, v_n\}$ and $E = \{\{v_1, v_2\}, \{v_2, v_3\}, \dots, \{v_{n-1}, v_n\}, \{v_n, v_1\}\}$.



How many edges are there in C_n ?

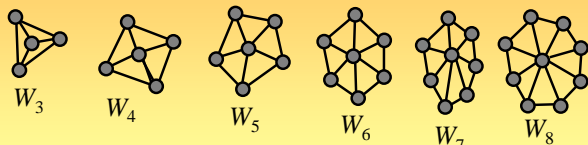
Note that in order to get a visually looking cycle, vertices should be sorted around a 'circle'

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Wheels

- For any $n \geq 3$, a *wheel* W_n , is a simple graph obtained by taking the cycle C_n and adding one extra vertex v_{hub} and n extra edges $\{\{v_{\text{hub}}, v_1\}, \{v_{\text{hub}}, v_2\}, \dots, \{v_{\text{hub}}, v_n\}\}$.



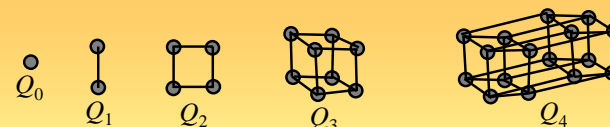
How many edges are there in W_n ?

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n -cubes (hypercubes)

- For any $n \in \mathbf{N}$, the hypercube Q_n is a simple graph consisting of two copies of Q_{n-1} connected together at **corresponding** nodes. Q_0 has 1 node.



Number of vertices: 2^n . Number of edges: An exercise to try in class!

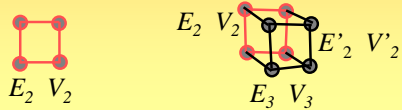
$$|E_n| = 2 * |E_{n-1}| + |V_{n-1}|$$

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***n*-cubes (hypercubes)**

- For any $n \in \mathbf{N}$, the hypercube Q_n can be defined recursively as follows:
 - $Q_0 = \{\{v_0\}, \emptyset\}$ (one node and no edges)
 - For any $n \in \mathbf{N}$, if $Q_n = (V, E)$, where $V = \{v_1, \dots, v_a\}$ and $E_n = \{e_1, \dots, e_b\}$, then $Q_{n+1} = (V \cup \{v_1', \dots, v_a'\}, E_{n+1} = E_n \cup \{e_1', \dots, e_b'\} \cup \{\{v_1, v_1'\}, \{v_2, v_2'\}, \dots, \{v_a, v_a'\}\})$ where v_1', \dots, v_a' are new vertices, and where if $e_i = \{v_j, v_k\}$ then $e_i' = \{v_j', v_k'\}$.



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Bipartite Graphs

- Skipping this topic for this semester...

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Complete Bipartite Graphs

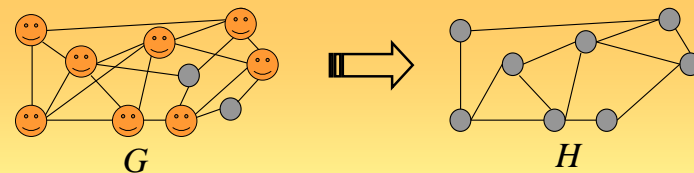
- Skip...

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Subgraphs


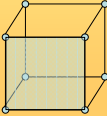
- A subgraph of a graph $G = (V, E)$ is a graph $H = (W, F)$ where $W \subseteq V$ and $F \subseteq E$.



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Subgraphs

Notice that the 2-cube  occurs inside the 3-cube . In other

words, Q_2 is a subgraph of Q_3 :

Q: How many Q_2 subgraphs does Q_3 have?

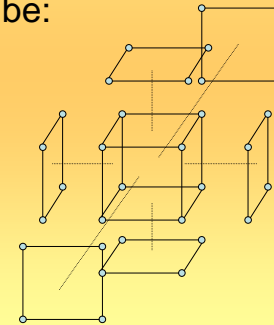
6, see next slide!

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Subgraphs

A: Each face of Q_3 is a Q_2 subgraph so the answer is **6**, as this is the number of sides of a 3-cube:

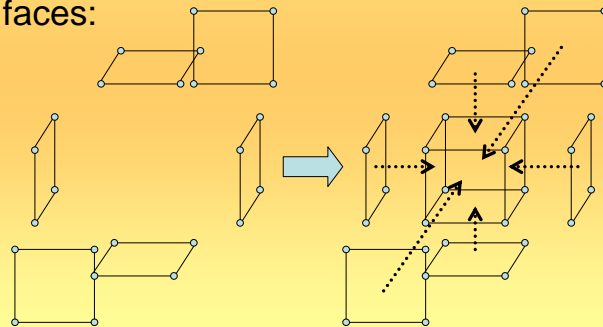


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Graph Unions

In previous example one can actually reconstruct the 3-cube from its 6 2-cube faces:

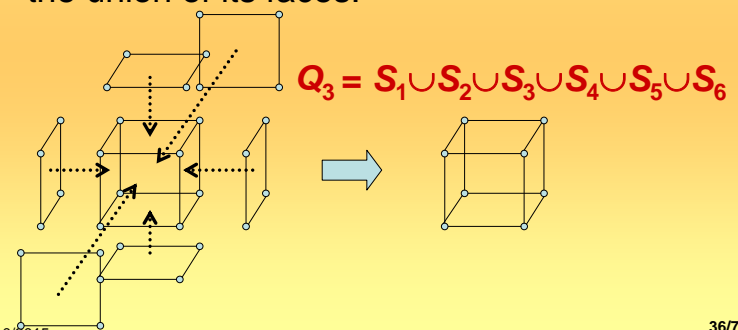


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Unions

If we assign the 2-cube sides (i.e., squares) the names $S_1, S_2, S_3, S_4, S_5, S_6$ then Q_3 is the union of its faces:



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Graph Unions

- The *union* $G_1 \cup G_2$ of two simple graphs $G_1=(V_1, E_1)$ and $G_2=(V_2, E_2)$ (where V_1, V_2 may or may not be disjoint) is the simple graph $(V_1 \cup V_2, E_1 \cup E_2)$, i.e.,
 - $G_1 \cup G_2 = (V_1 \cup V_2, E_1 \cup E_2)$

A similar definitions can be created for unions of digraphs, multigraphs, pseudographs, etc.

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§ 9.3 Graph Representations & Isomorphism

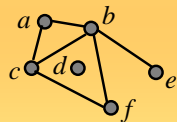
- Graph representations:
 - Adjacency lists.
 - Adjacency matrices.
 - Incidence matrices.
- Graph isomorphism:
 - Two graphs are isomorphic iff they are identical except for their node names.

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Adjacency Lists

- A table with **1 row per vertex**, listing its adjacent vertices.



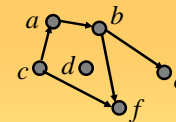
Vertex	Adjacent Vertices
a	b, c
b	a, c, e, f
c	a, b, f
d	
e	b
f	c, b

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Directed Adjacency Lists

- 1 row per node**, listing the terminal nodes of each edge **incident** from that node.



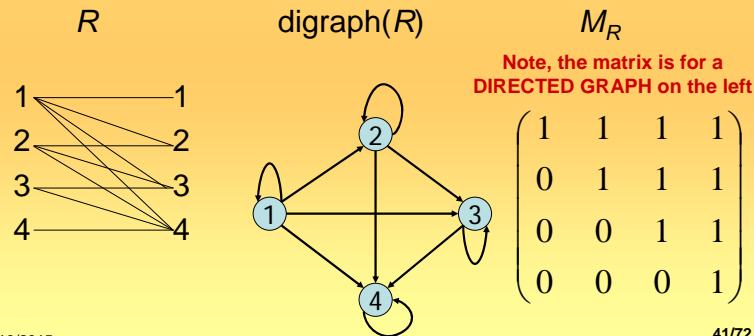
Vertex	Adjacent Vertices
a	b, c
b	a, c, d, e, f
c	a, b, f
d	
e	b
f	c, b

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Adjacency Matrix

We already saw a way of representing relations on a set with a Boolean matrix:

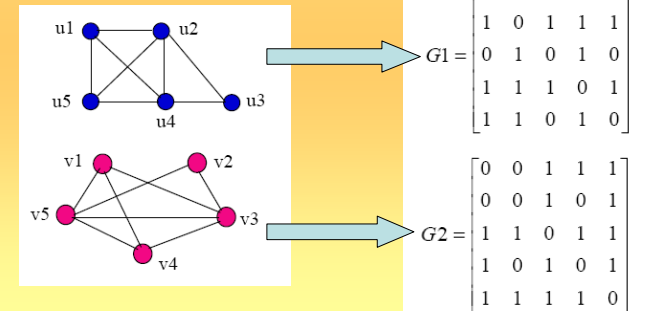


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Adjacency Matrices

- Matrix $A=[a_{ij}]$, where a_{ij} is 1 if $\{v_i, v_j\}$ is an edge of G , 0 otherwise.



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Adjacency Matrix (Directed Multigraphs)

Can easily generalize to **directed** multigraphs by putting in the number of edges between vertices, instead of only allowing 0 and 1:

For a **directed multigraph** $G = (V, E)$ define the matrix A_G by:

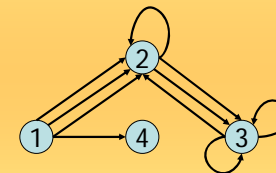
- Rows, Columns –one for each vertex in V
- Value at i^{th} row and j^{th} column is
 - The number of edges with source the i^{th} vertex and target the j^{th} vertex

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Adjacency Matrix -Directed Multigraphs

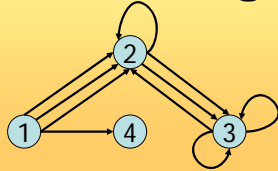
Q: What is the adjacency matrix?



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Adjacency Matrix -Directed Multigraphs



A:

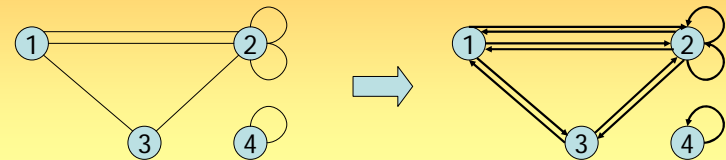
$$\begin{pmatrix} 0 & 3 & 0 & 1 \\ 0 & 1 & 2 & 0 \\ 0 & 1 & 2 & 0 \\ 0 & 0 & 0 & 0 \end{pmatrix}$$

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Adjacency Matrix-General

Undirected graphs can be viewed as directed graphs by turning each undirected edge into two oppositely oriented directed edges, *except when the edge is a self-loop in which case only 1 directed edge is introduced*. EG:

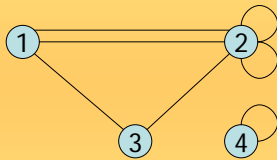


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Adjacency Matrix-General

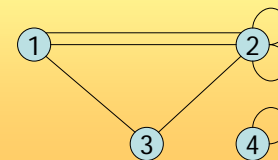
Q: What's the adjacency matrix?



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Adjacency Matrix-General



A:

$$\begin{pmatrix} 0 & 2 & 1 & 0 \\ 2 & 2 & 1 & 0 \\ 1 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}$$

Notice that answer is *symmetric*.

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Adjacency Matrix-General

For an undirected graph $G = (V, E)$ define the matrix A_G by:

- Rows, Columns –one for each element of V
- **Value at i^{th} row and j^{th} column is the number of edges incident with vertices i and j .**

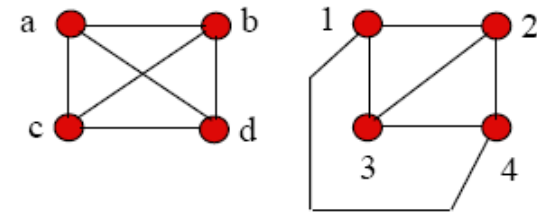
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Isomorphism

The two graphs below are really the same graph.

One is drawn so that no edges intersect (planar).



We say these graphs are *isomorphic*.

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Graph Isomorphism

- Formal definition:
 - Simple graphs $G_1=(V_1, E_1)$ and $G_2=(V_2, E_2)$ are *isomorphic* iff \exists a **bijection** $f: V_1 \rightarrow V_2$ such that $\forall a, b \in V_1$, a and b are adjacent in G_1 iff $f(a)$ and $f(b)$ are adjacent in G_2 .
 - **f is the “renaming” function that makes the two graphs identical.**
 - Definition can easily be extended to other types of graphs.

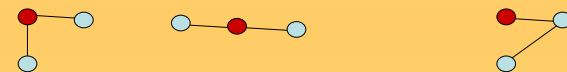
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Graph Invariants under Isomorphism

Necessary but not *sufficient* conditions for $G_1=(V_1, E_1)$ to be isomorphic to $G_2=(V_2, E_2)$:

$$|V_1|=|V_2|, |E_1|=|E_2|.$$

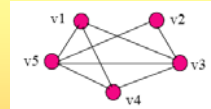
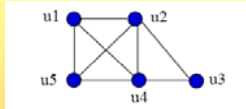


- The number of vertices with degree n is the same in both graphs.
- For every proper subgraph g of one graph, there is a proper subgraph of the other graph that is isomorphic to g .

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Are the following 2 graphs isomorphic?



Note! Proving isomorphism is a very hard problem. Doing it by hand is a bummer!!! Why?

Invariants - things that $G1$ and $G2$ must have in common to be isomorphic:

- the same number of vertices
- the same number of edges
- degrees of corresponding vertices are the same.
- if one is bipartite, the other must be
- if one is complete, the other must be
- if one is a wheel, the other must be
- etc.

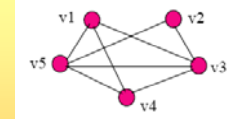
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Solution

Check . . .

- They have the same number of vertices = 5
- They have the same number of edges = 8
- They have the same number of vertices with the same degrees: 2, 3, 3, 4, 4.

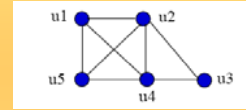


• Now we try to construct the isomorphism f using the degrees of vertices to help us.

- $\deg(u3) = \deg(v2) = 2$ so

$$f(u3) = v2 \quad \boxed{1}$$

is our only choice.



• $\deg(u1) = \deg(u5) = \deg(v1) = \deg(v4) = 3$ so we must have either

- i) $f(u1) = v1$ and $f(u5) = v4$ $\boxed{2}$ $\boxed{3}$
- or
- ii) $f(u1) = v4$ and $f(u5) = v1$

Perhaps either choice will work.

• Finally since $\deg(u2) = \deg(u4) = \deg(v3) = \deg(v5) = 4$ we must have either

- $\boxed{4}$ i) $f(u2) = v3$ and $f(u4) = v5$ $\boxed{5}$
- or
- ii) $f(u2) = v5$ and $f(u4) = v3$.

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We first try the relabeling using i) in each case to get the function

$$\boxed{1} \quad \boxed{2} \quad \boxed{3} \quad \boxed{4} \quad \boxed{5}$$

$$3 \rightarrow 2, 1 \rightarrow 1, 5 \rightarrow 4, 2 \rightarrow 3, 4 \rightarrow 5$$

• permute the rows and columns of the adjacency matrix of $G1$ using the above map to see if we get the adjacency matrix of $G2$.

or

• change the labels of the graph $G2$ to produce the graph $G2^*$ according to the above permutation and recalculate the adjacency matrix. Recall:

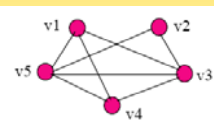
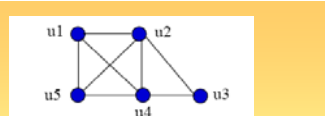
Permutation Matrix

$$P = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 1 \\ 0 & 0 & 0 & 1 & 0 \end{bmatrix}$$

Adj. matrices without relabeling

$$G1 = \begin{bmatrix} 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 & 1 \\ 0 & 1 & 0 & 1 & 0 \\ 1 & 1 & 1 & 0 & 1 \\ 1 & 1 & 0 & 1 & 0 \end{bmatrix}$$

$$G2 = \begin{bmatrix} 0 & 0 & 1 & 1 & 1 \\ 0 & 0 & 1 & 0 & 1 \\ 1 & 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 \\ 1 & 1 & 1 & 1 & 0 \end{bmatrix}$$



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MATLAB CODE relabeling i

```
G1 = [0 1 0 1 1
      1 0 1 1 1
      0 1 0 1 0
      1 1 1 0 1
      1 1 0 1 0]
P = [1 0 0 0 0
     0 0 1 0 0
     0 1 0 0 0
     0 0 0 0 1
     0 0 0 1 0]
```

Instructor only: Run the code isomorphism_graphs.m

% Multiply from LEFT to permute the ROWS

$G1r = P * G1$ \rightarrow $\begin{bmatrix} 0 & 1 & 0 & 1 & 1 \\ 0 & 1 & 0 & 1 & 0 \\ 1 & 0 & 1 & 1 & 1 \\ 1 & 1 & 0 & 1 & 0 \\ 1 & 1 & 1 & 0 & 1 \end{bmatrix}$

% Multiply from RIGHT to permute the COLUMNNS

$G2_star = G1r * P$ \rightarrow $\begin{bmatrix} 0 & 0 & 1 & 1 & 1 \\ 0 & 0 & 1 & 0 & 1 \\ 1 & 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 0 & 1 \\ 1 & 1 & 1 & 1 & 0 \end{bmatrix}$

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MATLAB CODE relabeling *ii*

```
G1 = [0 1 0 1 1
      1 0 1 1 1
      0 1 0 1 0
      1 1 1 0 1
      1 1 0 1 0]
P = [0 0 0 1 0
     0 0 0 0 1
     0 1 0 0 0
     0 0 1 0 0
     1 0 0 0 0]
```

% Multiply from LEFT to permute the ROWS

G1r = P*G1

```
0 1 0 1 1
0 1 0 1 0
1 0 1 1 1
1 1 0 1 0
1 1 1 0 1
```

% Multiply from RIGHT to permute the COLUMNS

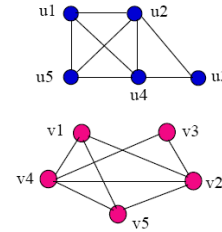
G2_star = G1r*P

```
0 0 1 1 1
0 0 1 0 1
1 1 0 1 1
1 0 1 0 1
1 1 1 1 0
```

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The new labeling of $G2$, $G2^*$, becomes



The new adjacency matrix becomes:

$$G2^* = \begin{bmatrix} 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 & 1 \\ 0 & 1 & 0 & 1 & 0 \\ 1 & 1 & 1 & 0 & 1 \\ 1 & 1 & 0 & 1 & 0 \end{bmatrix}$$

which is the same adjacency matrix as for $G1$. Hence we have found an isomorphism!

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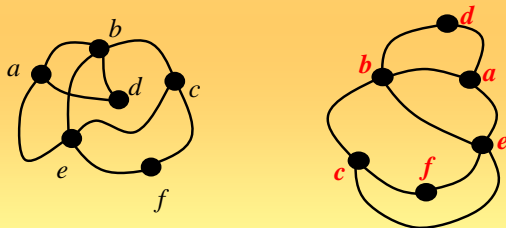
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Solution, cont.

If we did the same steps by multiplying $G2$ by P from left and right we would have got

Isomorphism Example

- If isomorphic, label the 2nd graph to show the isomorphism, else identify difference.

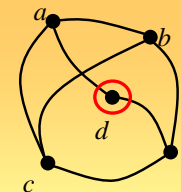


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Are These Isomorphic?

- If isomorphic, label the 2nd graph to show the isomorphism, else identify difference.

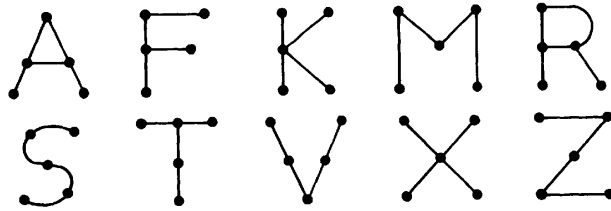


- * Same # of vertices
- * Same # of edges
- * Different # of verts of degree 2! (1 vs 3)

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Which of the graphs below are isomorphic?



A & R,

F & T,

K & X,

M, S, V & Z

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§ 9.4 Connectivity

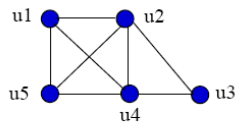
- In an **undirected** graph, a *path of length n* from u to v is a **sequence of adjacent edges** going from vertex u to vertex v .
- A path is a **circuit** if $u=v$, i.e., if it ends at u
- A path *traverses* the vertices along it.
- A path is **simple** if it contains no **edge more than once**.

Note: There is nothing to prevent traversing an edge back and forth to produce arbitrarily long paths. This is usually **not interesting** which is why we define a simple path.

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Example:



There are many paths from $u1$ to $u3$ in $G1$:

1) $u1, u4, u2, u3$; length = 3, the path is simple

2) $u1, u5, u4, u1, u2, u3$; length = 5, the path is simple and it contains a circuit $u1, u5, u4, u1$.

3) $u1, u2, u5, u4, u3$; length = 4, the path is simple

How many simple paths are there?

5, 8, 9, 10, or more ?

Count!!!

It's tricky, isn't it?

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Paths in Directed Graphs

- Same as in **undirected** graphs, but **the path must go in the direction of the arrows**.

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Connectedness

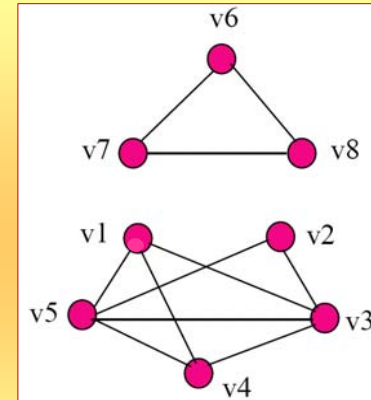
- An **undirected** graph is **connected** iff there is a path between **every pair of distinct vertices** in the graph.
- Theorem: There is a **simple** path between any pair of vertices in a **connected** undirected graph.
- **Connected component**: connected subgraph
- A **cut vertex** or **cut edge** separates 1 connected component into 2 if removed.

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Example

Which of these 2 graphs is a connected graph?



Both are!!!

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Directed Connectedness

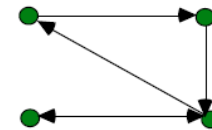
- A **directed** graph is **strongly connected** iff there is a directed path from a to b for any two vertices a and b .
- It is **weakly connected** iff the **underlying undirected graph** (*i.e.*, with edge directions removed) is connected.
- Note **strongly** implies **weakly** but not vice-versa.

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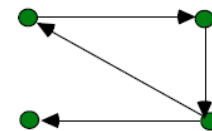
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Examples:

- strongly connected (hence weakly connected)



- not strongly connected but weakly connected.



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Paths & Isomorphism

- Note that connectedness, and the existence of a circuit or simple circuit of length k are graph invariants with respect to isomorphism.

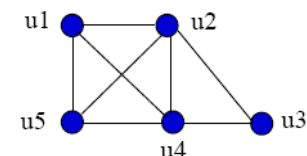
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Counting Paths w Adjacency Matrices

- Let \mathbf{A} be the adjacency matrix of graph G .
- The number of paths of length k from v_i to v_j is equal to $(\mathbf{A}^k)_{i,j}$. (The notation $(\mathbf{M})_{i,j}$ denotes $m_{i,j}$ where $[m_{i,j}] = \mathbf{M}$.)

Example:



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Caution!!!

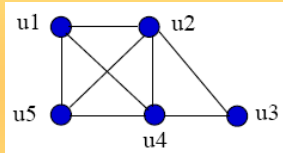
- We are analyzing **undirected** graphs here
- So, there will be differences in respect to math we used in Transitive Closures
- There, we used **Boolean Product**
- Here, we'll use a classic/standard matrix product
- Hence, **the matrices we'll get will tell us some new stories. They will give us some novel and different insights.**

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How many **2-paths** are there between vertices

1-1
1-2
2-2 ?



Number of 1-paths are in \mathbf{M}

$$\mathbf{M} = \begin{bmatrix} 0 & 1 & 0 & 1 & 1 \\ 1 & 0 & 1 & 1 & 1 \\ 0 & 1 & 0 & 1 & 0 \\ 1 & 1 & 1 & 0 & 1 \\ 1 & 1 & 0 & 1 & 0 \end{bmatrix}$$

$$\mathbf{M}^2 = \begin{bmatrix} 3 & 2 & 2 & 2 & 2 \\ 2 & 4 & 1 & 3 & 2 \\ 2 & 1 & 2 & 1 & 2 \\ 2 & 3 & 1 & 4 & 2 \\ 2 & 2 & 2 & 2 & 3 \end{bmatrix}$$

How many **3-paths** are there between vertices

1-1
1-2
2-2 ?

$$\mathbf{M}^3 = \begin{bmatrix} 6 & 9 & 4 & 9 & 7 \\ 9 & 8 & 7 & 9 & 9 \\ 4 & 7 & 2 & 7 & 4 \\ 9 & 9 & 7 & 8 & 9 \\ 7 & 9 & 4 & 9 & 6 \end{bmatrix}$$

Reminder for lecturer only!
RUN GRAPHS.M, now!!!

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Here, the **Graphs** stories end, and the **Chapter 9** on **Trees** start.

As it may be suspected, **Trees** are just special subgroups of **Graphs** but, due to their importance and overall usefulness **Trees** are treated separately and in details!!!

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