## BIL694-Lecture 1: Introduction to Graphs

## Lecturer: Lale Özkahya

Resources for the presentation: http://www.math.ucsd.edu/ gptesler/184a/calendar.html http://www.inf.ed.ac.uk/teaching/courses/dmmr/

#### 1 Simple Graph, Multigraphs and Directed Graphs

### 2 Graph Isomorphism

Special Families of Graphs



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## Graphs



We have a network of items and connections between them. Examples:

- Telephone networks, computer networks
- Transportation networks (bus/subway/train/plane)
- Social networks
- Family trees, evolutionary trees
- Molecular graphs (atoms and chemical bonds)
- Various data structures in Computer Science

Ch. 9. Graph Theory

Graphs



• The dots are called *vertices* or *nodes* (singular: vertex, node)

$$V = set of vertices = \{1, 2, 3, 4, 5\}$$

- The connections between vertices are called *edges*.
- Represent an edge as a set {*i*, *j*} of two vertices.
  E.g., the edge between 2 and 5 is {2, 5} = {5, 2}.

$$E = \text{set of edges} = \{\{1, 2\}, \{2, 3\}, \{2, 5\}, \{3, 4\}, \{3, 5\}, \{4, 5\}\}\}$$

## Simple graphs



#### A simple graph is G = (V, E):

- V is the set of vertices.
   It can be any set; {1,...,n} is just an example.
- *E* is the set of edges, of form {*u*, *v*}, where *u*, *v* ∈ *V* and *u* ≠ *v*.
   Every pair of vertices has either 0 or 1 edges between them.
- The drawings above represent the same abstract graph since they have the same *V* and *E*, even though the drawings look different.





The *degree* of a vertex is the number of edges on it.

$$d(1) = 1$$
  $d(2) = 3$   $d(3) = 3$   $d(4) = 2$   $d(5) = 3$   
Sum of degrees =  $1 + 3 + 3 + 2 + 3 = 12$ 

Number of edges = 6

#### Theorem

The sum of degrees of all vertices is twice the number of edges:

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

#### Proof.

• Let  $S = \{ (v, e) : v \in V, e \in E, \text{ vertex } v \text{ is in edge } e \}$ 

• Count |S| by vertices: Each vertex v is contained in d(v) edges, so

$$|S| = \sum_{v \in V} d(v).$$

• Count |S| by edges: Each edge has two vertices, so

$$|S| = \sum_{e \in E} 2 = 2|E|$$
.

## **Multigraphs**



- Some networks have *multiple edges* between two vertices.
   Notation {3, 4} is ambiguous, so write labels on the edges: *c*, *d*, *e*.
- There can be an edge from a vertex to itself, called a *loop* (such as *h* above). A loop has one vertex, so {2, 2} = {2}.
- A simple graph does not have multiple edges or loops.

## **Multigraphs**



- Computer network with multiple connections between machines.
- Transportation network with multiple routes between stations.
- **But:** A graph of Facebook friends is a simple graph. It does not have multiple edges, since you're either friends or you're not. Also, you cannot be your own Facebook friend, so no loops.



A *multigraph* is  $G = (V, E, \phi)$ , where:

- V is the set of vertices. It can be any set.
- *E* is the set of edge labels (with a unique label for each edge).
- $\phi: E \to \{\{u, v\} : u, v \in V\}$ is a function from the edge labels to the pairs of vertices.
  - $\phi(L) = \{u, v\}$  means the edge with label *L* connects *u* and *v*.

## Adjacency matrix of a multigraph

- Let n = |V|
- The *adjacency matrix* of a multigraph is an  $n \times n$  matrix  $A = (a_{uv})$ . Entry  $a_{uv}$  is the number of edges between vertices  $u, v \in V$ .



•  $a_{uv} = a_{vu}$  for all vertices u, v. Thus, A is a symmetric matrix  $(A = A^T)$ .

- The sum of entries in row *u* is the degree of *u*.
- Technicality: A loop on vertex v counts as
  - 1 edge in E,
  - degree 2 in d(v) and in  $a_{vv}$  (it touches vertex v twice),

With these rules, graphs with loops also satisfy  $\sum_{v \in V} d(v) = 2 |E|$ .

## Adjacency matrix of a simple graph

#### In a simple graph:

- All entries of the adjacency matrix are 0 or 1 (since there either is or is not an edge between each pair of vertices).
- The diagonal is all 0's (since there are no loops).



$$A = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 \\ 0 & 1 & 0 & 0 & 0 \\ 2 & 1 & 0 & 1 & 0 & 1 \\ 4 & 0 & 1 & 0 & 1 & 1 \\ 0 & 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 1 & 0 \end{bmatrix}$$

## Directed graph (a.k.a. digraph)



- A *directed edge* is a connection with a direction.
- One-way transportation routes.
- Broadcast TV and satellite TV are one-way connections from the broadcaster to your antenna.
- Familiy tree: parent  $\rightarrow$  child
- An unrequited Facebook friend request.

## Directed graph (a.k.a. digraph)



- Represent a directed edge  $u \rightarrow v$  by an ordered pair (u, v). E.g.,  $3 \rightarrow 2$  is (3, 2), but we do not have  $2 \rightarrow 3$ , which is (2, 3).
- A directed graph is *simple* if each (*u*, *v*) occurs at most once, and there are no loops.
  - Represent it as G = (V, E).
  - V is a set of vertices. It can be any set.
  - *E* is the set of edges. Each edge has form (u, v) with  $u, v \in V$ ,  $u \neq v$ .
  - It is permissible to have both (4,5) and (5,4), since they are distinct.

## Degrees in a directed graph



• For a vertex *v*, the *indegree* is the number of edges going into *v*, and the *outdegree* is the number of edges going out from *v*.

v	indegree(v)	outdegree(v)
1	1	1
2	2	1
3	0	2
4	2	1
5	2	2
Total	7	7

• The sum of indegrees is |E| and the sum of outdegrees is |E|.

## Adjacency matrix of a directed graph



- Let n = |V|
- The *adjacency matrix* of a directed graph is an  $n \times n$  matrix  $A = (a_{uv})$  with  $u, v \in V$ .
- Entry  $a_{uv}$  is the number of edges directed from u to v.
- $a_{uv}$  and  $a_{vu}$  are not necessarily equal, so A is usually not symmetric.
- The sum of entries in row *u* is the outdegree of *u*. The sum of entries in column *v* is the indegree of *v*.

## Directed multigraph



$$A = \begin{bmatrix} 1 & 2 & 3 & 4 & 5 \\ 1 & 0 & 0 & 0 & 1 \\ 2 & 1 & 0 & 0 & 0 & 0 \\ 4 & 0 & 1 & 0 & 1 & 0 \\ 0 & 1 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \\ 0 & 2 & 0 & 1 & 0 \end{bmatrix}$$

$$V = \{1, \dots, 5\} \qquad \varphi(a) = (2, 1) \qquad \varphi(d) = (3, 2) \qquad \varphi(g) = (3, 4)$$
  

$$E = \{a, \dots, i\} \qquad \varphi(b) = (1, 5) \qquad \varphi(e) = (5, 2) \qquad \varphi(h) = (4, 5)$$
  

$$\varphi(c) = (1, 1) \qquad \varphi(f) = (5, 2) \qquad \varphi(i) = (5, 4)$$

• A directed multigraph may have loops and multiple edges.

- Represent it as  $G = (V, E, \phi)$ .
- Name the edges with labels. Let *E* be the set of the labels.
- $\phi(L) = (u, v)$  means the edge with label *L* goes from *u* to *v*.

• **Technicality:** A loop counts once in indegree, outdegree, and  $a_{\nu\nu}$ .

#### 1 Simple Graph, Multigraphs and Directed Graphs

### 2 Graph Isomorphism

Special Families of Graphs



## Isomorphism of Graphs

**Definition**: Two (undirected) graphs G1 = (V1, E1) and G2 = (V2, E2) are *isomorphic* if there is a bijection,  $f:V_1 \rightarrow V_2$ , with the property that for all vertices  $a, b \in V_1$ 

 $\{a,b\} \in E_1$  if and only if  $\{f(a),f(b)\} \in E_2$ 

Such a function *f* is called an *isomorphism*. Intuitively, isomorphic graphs are "THE SAME", except for "renamed" vertices.

**Example**: Show that the graphs G = (V, E) and H = (W, F) are isomorphic.



**Solution**: The function f with f(u1) = v1, f(u2) = v4, f(u3) = v3, and f(u4) = v2 is a one-to-one correspondence between V and W.

It is difficult to determine whether two graphs are isomorphic by brute force: there are *n*! bijections between vertices of two n-vertex graphs.

Often, we can show two graphs are not isomorphic by finding a property that only one of the two graphs has. Such a property is called graph invariant:

 e.g., number of vertices of given degree, the degree sequence (list of the degrees), .....

Example: Are these graphs are isomorphic?



**Solution**: No! Since deg(a) = 2 in *G*, *a* must correspond to *t*, *u*, *x*, or *y*, since these are the vertices of degree 2 in H. But each of these vertices is adjacent to another vertex of degree 2 in *H*, which is not true for *a* in *G*. So, G and H can not be isomorphic.

**Example**: Determine whether these two graphs are isomorphic.



**Solution**: The function *f* is defined by: f(u1) = v6, f(u2) = v3, f(u3) = v4, f(u4) = v5, f(u5) = v1, and f(u6) = v2 is a bijection.

## Algorithms for Graph Isomorphism

- The best algorithms known for determining whether two graphs are isomorphic have exponential worst-case time complexity (in the number of vertices of the graphs).
- However, there are algorithms with good time complexity in many practical cases.
- See, e.g., a publicly available software called NAUTY for graph isomorphism.

## Applications of Graph Isomorphism

The question whether graphs are isomorphic plays an important role in applications of graph theory. For example:

Chemists use molecular graphs to model chemical compounds. Vertices represent atoms and edges represent chemical bonds. When a new compound is synthesized, a database of molecular graphs is checked to determine whether the new compound is isomorphic to the graph of an already known one.

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# Special Types of Graphs: Complete Graphs

A complete graph on *n* vertices, denoted by  $K_n$ , is the simple graph that contains exactly one edge between each pair of distinct vertices.



## Special Types of Graphs: Cycles

A cycle  $C_n$  for  $n \ge 3$  consists of n vertices v1, v2,..., vn, and edges {v1, v2}, {v2, v3},..., {vn-1, vn}, {vn, v1}.



## Special Types of Simple Graphs: *n*-Cubes

An *n*-dimensional hypercube, or *n*-cube, is a graph with  $2^n$  vertices representing all bit strings of length *n*, where there is an edge between two vertices if and only if they differ in exactly one bit position.



## **Bipartite Graphs**

## **Definition:**

An equivalent definition of a bipartite graph is one where it is possible to color the vertices either red or blue so that no two adjacent vertices are the same color.



## Bipartite Graphs (continued)

**Example**: Show that  $C_6$  is bipartite. **Solution**: Partition the vertex set into  $V1 = \{v1, v3, v5\}$  and  $V2 = \{v2, v4, v6\}$ :



**Example**: Show that  $C_3$  is not bipartite. **Solution**: If we partition vertices of  $C_3$  into two nonempty sets, one set must contain two vertices. But every vertex is connected to every other. So, the two vertices in the same partition are connected. Hence,  $C_3$  is not bipartite.

## **Complete Bipartite Graphs**

**Definition:** A complete bipartite graph is a graph that has its vertex set partitiong into two subsets  $V_1$  of size m and  $V_2$  of size nsuch that there is an edge from every vertex in  $V_1$  to every vertex in  $V_2$ .



## Subgraphs

## **Definition:** A subgraph of a graph G = (V,E) is a graph (W,F), where $W \subseteq V$ and $F \subseteq E$ . A subgraph H of G is a proper subgraph of G if $H \neq G$ .

**Example**: here is  $K_5$  and one of its (proper) subgraphs:



## Induced Subgraphs

**Definition:** Let G = (V, E) be a graph. The subgraph induced by a subset W of the vertex set V is the graph H = (W,F), whose edge set F contains an edge in E if and only if both endpoints are in W.

**Example**: Here is  $K_5$  and its induced subgraph induced by  $W = \{a, b, c, e\}$ .



A graph is bipartite if and only if it has no odd cycle.

Proof

- Assume that G has no odd cycle, show that G is bipartite.
- Let u ∈ V(G) and for each v ∈ V(G), let f(v) be the minimum length of a u, v-path (finite, assuming G is connected).
- $X := \{v \in V(G) : f(v) \text{ is even}\}, \qquad Y := \{v \in V(G) : f(v) \text{ is odd}\}.$

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- $X := \{v \in V(G) : f(v) \text{ is even}\}, \quad Y := \{v \in V(G) : f(v) \text{ is odd}\}.$
- Any edge in  $vw \in G[X]$ , together with the shortest u, v- and u, w-paths create an odd walk, call it W. (Same if vw is an edge in G[Y])

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- Therefore, X and Y are independent sets.
- Same ideas can be applied for each component, if G had more than one component.

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## Connectness in undirected graphs

**Definition:** An undirected graph G = (V, E) is called connected, if there is a path between every pair of distinct vertices. It is called disconnected otherwise.



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A (10) F (10)



- Trace along edges from vertex *x* to *y*, without lifting your pen.
- The walk in yellow is represented as a sequence of edges *c*,*f*,*g*,*i*, or a sequence of vertices 1, 2, 5, 4, 3.
- A *walk* from vertex *x* to *y* is a sequence of edges, each connected to the next by a vertex:

 $e_1 = \{x, v_1\}$   $e_2 = \{v_1, v_2\}$   $e_3 = \{v_2, v_3\}$   $\cdots$   $e_k = \{v_{k-1}, y\}$ In a directed graph, edge directions must be respected:

 $e_1 = (x, v_1)$   $e_2 = (v_1, v_2)$   $e_3 = (v_2, v_3)$   $\cdots$   $e_k = (v_{k-1}, y)$ 



- In a *walk*, edges and vertices may be re-used.
- A *trail* is a walk with all edges distinct.
- A *path* is a walk with all vertices and edges distinct.
- A walk/trail/path is *open* if the start and end vertices are different, and *closed* if they are the same (this is allowed in a closed path, but no other vertices may be repeated).
- A *cycle* is a closed path.

A tree is a simple connected graph that contains no cycle.

Theorem		
The following statements are equivalent for a graph T:		
1 T is a tree;		
<b>2</b> Any two vertices of T are connected by a unique path in $T$ ;		
<b>3</b> T is minimally connected, that is, T is connected but $T - e$ is		
disconnected for every edge $e$ in $T$ ;		
• T is maximally acylic, that is T contains no cycle, but $T + xy$ does,		

for any two non-adjacent vertices x, y in T.

Corollary: Every tree has at least two vertices with degree 1.

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Corollary: The vertices of a tree can always be enumerated, say as  $v_1, \ldots, v_n$  so that every  $v_i$  with  $i \ge 2$  has a unique neighbor in  $\{v_1, \ldots, v_{i-1}\}$ .

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Corollary: A connected graph with n vertices is a tree if and only if it has n-1 edges. Proof: Exercise, use induction on n **Corollary**: Every tree has at least two vertices with degree 1. Proof: Take any longest simple path  $x_0, \ldots, x_m$  in T. Both  $x_0$  and  $x_m$  must have degree 1: otherwise there is a longer path in T.

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Corollary: If T is a tree and G is any graph with  $\delta(G) \ge |T| - 1$ , then  $T \subset G$ , that is G has a subgraph isomorphic to T. Proof Construct T by using a greedy algorithm.

## The Königsberg Bridge Problem Leonard Euler (1707-1783) was asked to solve the following:



**Question:** Can you start a walk somewhere in Königsberg, walk across each of the 7 bridges exactly once, and end up back where you started from?

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Euler (in 1736) used "graph theory" to answer this question.

#### Theorem

A connnected graph G is Eulerian if and only if all of its vertices have even degree.

#### Proof

**Necessity:** Add direction to each edge as it is visited along the Eulerian circuit. Since each vertex has indegree equal to its outdegree, the degree (undirected) of each vertex is even.

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- Basis step: m = 0, true.
- Key Lemma: (Lemma 1.2.25): If every vertex of a graph G has degree at least 2, then G contains a cycle.
- Since every vertex in G has even degree, every vertex has degree at least 2 in every component of G. By the key lemma, there is a cycle in each component of G.

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- So, pick a cycle in one component, call it C. Let G' := G C.
- By inductive hypothesis, every component of G' has an Euler circuit D.
- D, together with C is an Euler circuit of G.

#### Corollary

Every even graph (all degree even) decomposes into cycles.

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#### Proposition

If for a graph G,  $\delta(G) \ge k$ , then G contains a  $P_{k+1}$ . If  $k \ge 2$ , then G also contains a cycle of length at least k + 1.