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Lecture 10



Graph Theory basics refresher & continuation

-undirected





V = {1,2,3,4,5}

 $E = \{\{1,3\},\{1,4\},\{1,5\}, \{2,4\},\{2,5\},\{3,5\}\}$

Definition. An undirected graph G is an ordered pair (V,E) where

- V = V(G) is the set of vertices (or nodes)
- *E*=*E*(*G*) is the set of edges
- an edge is a set of two vertices

-directed





V = {1,2,3,4,5}

 $E = \{(3,1), (1,4), (5,1), (4,1), (5,2), (5,3)\}$

Definition. An undirected graph G is an ordered pair (V,E) where

- V = V(G) is the set of vertices (or nodes)
- *E*=*E*(*G*) is the set of edges
- an edge is an ordered pair of two vertices

-simple graphs: no loops, no multiple edges



V = {1,2,3,4,5}

 $E = \{\{1,3\},\{1,4\},\{1,4\},\{1,5\}, \{2,4\},\{2,5\},\{3,5\},\{2,2\}\}$

In directed graphs: two edges of different directions are different! Still simple graph



V = {1,2,3,4,5}

 $E = \{(3,1), (1,4), (4,1), (5,1), (4,1), (5,2), (5,3)\}$





-representations; directed graphs are binary relations-can be represented as adjacency matrices









-basic concepts: incidence (vertex-edge), neighbour(hood), adjacency





-degree of vertex deg(v)

 $\begin{cases} (1,e_1), (1,e_2), (2,e_1) \\ (2,e_3), (3,e_2), (3,e_3) \end{cases}$



Degree-sum formula:

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

Proof: consider all incidence pairs (e,v)...

Handshaking lemma: number of vertices with odd degree is even.

> **Proof:** sum separately odd degree and even degree vertex degrees. Sum of odd degree must be even. But if a sum of odd numbers is even, there must be an even number of odd numbers...



Representations, equality and isomorphism

Equal graphs: same set of vertices, and edges (can be *drawn* differently!)





Representations, equality and isomorphism

Equal graphs: same set of vertices, and edges (can be *drawn* differently!) Isomorphic graphs: sets of vertices *of same size*, *connected in the same way*



G&H Isomorphic: there exists a bijection f from V(G) to V(H), which preserves edges:

{x,y} is an edge in G if and only if
{f(x),f(y)} is amn edge in H



Representations, equality and isomorphism

Equal graphs: same set of vertices, and edges (can be *drawn* differently!) Isomorphic graphs: sets of vertices *of same size*, *connected in the same way*





Subgraphs, and vertex induced subgraphs





Edge and vertex removal: G-e = graph without edge e. G-v = graph without vertex v and all edges incident with G



Walking the graph...

Paths

Path: a sequence $v_1, e_1, v_2, e_2, ..., v_n$, with $e_k = \{v_k, v_{k+1}\}$

Lenght of path = number of edges in path (n)

We say: path from v_1 to v_2

Closed path: $v_1 = v_n$

In graphs (not multigraphs), vertices suffice: $v_1, e_1, v_2, e_2, \dots, v_n \rightarrow (v_1, v_2, \dots, v_n)$



u

 $v_1 \rightarrow v_2 \rightarrow \dots \rightarrow v_n$ $v_1 v_2 \dots v_n$

Paths: more concepts

simple path (walk): distinct vertices

trail: path with distinct edges

Closed path: $v_1 = v_n$



cycle: closed path of length > 2, all distinct vertices except first/last (essentially, closed simple path)

circuit: closed path, vertices may repeat, but edges cannot.



Same thing:

simple path: Vertices may not repeat. Edges may not repeat.

trail:Vertices may repeat.Edges cannot repeat. (a s.p. is a special trail.)

cycle: closed path of length > 2
Vertices cannot repeat. Edges cannot repeat (Closed)

circuit:







Same thing:

simple path: Vertices may not repeat. Edges may not repeat.

trail: Vertices may repeat. Edges cannot repeat.



trail (& not simp. path)



 $y \rightarrow v \rightarrow w \rightarrow u \rightarrow x \rightarrow v \rightarrow u \rightarrow y$

cycle: closed path of length > 2

Vertices cannot repeat. Edges cannot repeat (Closed)

circuit:



Same thing:

simple path: Vertices may not repeat. Edges may not repeat.

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$y \to v \to w \to u \to x \to y$

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circuit:

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Same thing:

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circuit (& not a cycle)



 $y \rightarrow v \rightarrow w \rightarrow u \rightarrow x \rightarrow v \rightarrow u \rightarrow y \rightarrow x$

cycle: closed path of length > 2
Vertices cannot repeat. Edges cannot repeat (Closed)

circuit:

Paths



Cycle and circuit not mutually exclusive.

Terminology *not* fully consistent between bodies of work. *Must be consistent within one work* Check (and *give*) definitions



Useful math...

Every day you go from home to school, and your trail ("the way you take") is such that you pass by the same bakery twice. Is there a faster way to school?



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A theorem...

Graph theory: yes.

Theorem 8.2. (Schaum) If there is a path between vertices *u* and *v*, then there is a simple path between *u* and *v*.

since a simple path never sees the same vertex twice it is shorter by at least one.



Theorem 8.2. If there is a path between vertices *u* and *v*, then there is a simple path between *u* and *v*.

In graphs, you can avoid going through the same vertex twice...

Constructive proofs
(vhat are constructive proofs?)
lave any path ... and simple ? I k sk.

$$p_{\mathcal{C}} U \rightarrow V_{1} \rightarrow V_{2} \rightarrow V_{3} \rightarrow \cdots \rightarrow V_{n} \rightarrow W_{1} \rightarrow W_{2} \rightarrow W_{n} \rightarrow V_{n} \rightarrow V_{k} \rightarrow V_{k+1} \rightarrow \cdots \rightarrow V$$

 $p_{\mathcal{C}} = U \rightarrow V_{1} \rightarrow V_{k+1} \rightarrow V_{k+1} \rightarrow \cdots \rightarrow V$ is a path
Repeat until simple ... (each step decreases length - must derminate)

Paths: more examples





$p \rightarrow t \rightarrow r \rightarrow t \rightarrow q$	not simple,not trail (edge repeats)		
$p \rightarrow r \rightarrow t \rightarrow p \rightarrow s \rightarrow q$	not simple, trail (only vertex repeats)		
$p \rightarrow r \rightarrow t \rightarrow q \rightarrow s$	simple trail		
р	not cycle		
p→r→p	not cycle (must be l>2)		
$r \rightarrow t \rightarrow p \rightarrow s \rightarrow q \rightarrow t \rightarrow r$	not cycle, not circuit		
$r \rightarrow t \rightarrow q \rightarrow s \rightarrow p \rightarrow r$	cycle & circuit		

Math culture: Euler, Seven Bridges of Königsberg and beginnings of graph theory.





15 April 1707 – 18 September 1783

"Read Euler, read Euler, he is the master of us all." - Laplace



Polyhedral formula : V - E + F = 2



$$\prod_{p \in \mathcal{P}} \frac{1}{1 - 1/p^s} = \zeta(s), \quad s > 1,$$



$$a^{\varphi(n)} \equiv 1 \pmod{n}.$$

$$\gamma = \lim_{n \to \infty} \left(1 + \frac{1}{2} + \frac{1}{3} \dots + \frac{1}{n} - \ln n \right) = 0.57721 \dots$$







Can we cross that, and every other brige... but only once?

"This question is so banal, but seemed to me worthy of attention in that [neither] geometry, nor algebra, nor even the art of counting was sufficient to solve it."

Seven Bridges of Königsberg

A multigraph problem...





	а	b	С	d
а	(0	2	1	0)
b	2	0	1	2
С	1	1	0	1
d	0	2	1	0)

Seven Bridges of Königsberg



A multigraph problems



Definition. A graph *G* is an ordered pair *(V,E) where*

- V = V(G) is the set of vertices
- *E*=*E*(*G*) is the set of edges

Graphs do not suffice...



Seven Bridges of Königsberg





• *E*=*E*(*G*) is the set of edges





Euler proved impossibility, and tackled generalizations; the result is graph theory as we know it...solution soon!

Main contribution: observation that only "connectedness" (topology), rather than actual positions matter...

A moment's thought



concepts, "mathematical objects", formalization, modelling, abstraction...

Bridges in reality, bridges on a map

V.S.

Graph — abstract concept

V.S.

graph (picture on paper), set-theoretical notation for a graph, adjacency matrix, incidence matrix,

V.S.

graph as a binary relation function (e.g. characteristic)





Isomorphic?

NO. GHAS TRIANGLES H DOESNOT

Check main properties...

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Digression



Showing non-isomorphism can be hard

Note: isomorphism is a relation on Graphs. What kind?

Graphs and connectedness

Definition. A graph is connected if every pair of vertices is connected by a path.

 $(\forall u, v \in V, \exists path(u, v))$

"there exists a path between" is a relation on $V \times V$

reflexive symmetric transitive

> Connected components: intuitive- "maximal" connected subgraphs





Graphs: bridge and cutpoint

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Def. <u>Bridge</u> is an edge e whose removal increases the number of connected components.

bridge, isthmus, cut-edge

Def. <u>Cut vertex</u> is a vetex v whose removal increases the number of connected components.

cut point, cut vertex, articulation points


Graphs: bridge and cutpoint

bridge, isthmus, cut-edge

cut point, cut vertex, articulation points

Def. Bridge is an edge e whose removal increases the number of connected components.

Def. Cut vertex is a vetex v whose removal increases the number of connected components.





Graphs: distance



Def. The <u>distance</u> d(u, v) between vertices u, v in graph G is the lenght of the <u>shortest path</u> between u and v in G.

Comment. If there is no path (u and v are in distinct connected components) we say the distance is infinite, $d(u, v) = \infty$

Theorem. Vertex distance obeys the triangle inequality: For all $u, v, w \in V$, $d(u, v) + d(v, w) \ge d(v, w)$

Proof. Cannot be more. Can be less.



Def. The <u>diameter of the graph G</u>, denoted <u>diam(G)</u>, is the distance between two maximally distant nodes which are connected by a path

Digression: graph centrality





A) Betweenness centrality, B) Closeness centrality, C) Eigenvector centrality,

D) Degree centrality, E) Harmonic Centrality and F) Katz centrality

https://en.wikipedia.org/wiki/Centrality

Digression: graph centrality





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https://en.wikipedia.org/wiki/Centrality

Social network analysis: how "central" nodes are in a graph. measure of importance.

That can be, for example, a measure that indicates

- (a) how many paths run through that node,
- (b) the total / average distance to the other nodes,
- (c) the degree of the node

The red side of spectrum indicates "more central"



http://liacs.leidenuniv.nl/~takesfw/SNACS/





Def. Euler circuit: closed trail which uses each edge exactly once.

"Can you draw the following without crossing any edge twice, ending where you started from?"

Aslo Seven bridges on multigraph!







Def. Euler trail: a trail which uses each edge exactly once.

Graphs with an Euler (Eulerian) trail are called Traversible

Theorem 8.3 (Euler): a finite connected graph has an Euler circuit if and only if every vertex has an even degree.







Def. Euler trail: a trail which uses each edge exactly once.

"Can you draw the following without crossing any edge twice?"

Corollary. An undirected connected graph has an Eulerian trail if and only if exactly zero or two vertices have odd degree.



Traversible and Eulerian Graphs



Corollary. An undirected connected graph has an Eulerian trail if and only if exactly zero or two vertices have odd degree.

Almost a proof:

Imagine an "inner" vertex of the trail



if degree odd, you are trapped = proof of necessity of $\phi/2$ vertex criterion,

Traversible and Eulerian Graphs

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Corollary. An undirected connected graph has an Eulerian trail if and only if exactly zero or two vertices have odd degree.





WE STOPPED HERE ...

Eulerian Graphs





The numbers of (connected) Eulerian graphs with n nodes are 1, 0, 1, 1, 4, 8, 37, 184, 1782, ... OEIS A003049

http://mathworld.wolfram.com/EulerianGraph.html



Def. Hamilton cycle: a closed path which uses each vertex exactly once. (closed = starts where it ends)





Def. Hamilton cycle: a closed path which uses each vertex exactly once. (closed = starts where it ends)



https://en.wikipedia.org/wiki/Regular_dodecahedron



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https://www.puzzlemuseum.com/month/picm02/200207icosian.htm

Euler v.s. Hamilton





Leonhard Euler Bridges of Königsburg Closed, each line once

William Rowan Hamilton

Icosian game Closed, each vertex once

Simple characterization Easy to detect

"Travelling salesperson problem"

Ore (1960). A graph with n-vertices (n > 3) is Hamiltonian if, for each pair of non-adjacent vertices, the sum of their degrees is n or greater.

V

If but not if and only if....NP-complete...

https://en.wikipedia.org/wiki/William_Rowan_Hamilton

Euler v.s. Hamilton (Schaum)







Euler v.s. Hamilton





Hamiltonian and non-Eulerian



Eulerian and non-Hamiltonian

"Note that an Eulerian circuit traverses every edge exactly once, but may repeat vertices, while a Hamiltonian circuit visits each vertex exactly once but may repeat edges." Schaum p.161



TYPOS and mistakes HAPPEN!

Schaum p.162 Theorem 8.5 (Dirac, 1952): Let G be a connected graph with n vertices. Then G is Hamiltonian if n > 3 and $n/2 \le deg(v)$ for each vertex v in G.

No need to know this theorem (for this course). It is an illustration of the type of propositions that have been obtained to encompass the concept of Hamiltonian.

Labeled graphs & weights

Labeled graph: information on the edges Weighted graph: values (numbers) on the edges

 $w: E \rightarrow$ Labels; or $w: E \rightarrow \mathbb{R}; w(e)$

Can mean: capacity (conductance, diameter), cost (time, distance)

- weight of a path:
- minimal spanning tree: *Prim's algorithm, Kruskal's algorithm*
- shortest ("cheapest") paths; *Dijksta's algorithm*

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IN OTHER

COURSES

Labeled graphs & weights

Labeled graph: information on the edges Weighted graph: values (numbers) on the edges

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Special graphs

complete graph K_n **bipartite graph complete bipartite graph** $K_{m,n}$ (or $K_{m \times n}$)





*K*_{3,2}

k-regular graph: all vertices degree *k*



Complete graphs





How many edges?

https://en.wikipedia.org/wiki/Complete_graph

Complete graphs



Extra info: Complete induced subgraphs are called *cliques*



Bipartite graphs



Def. A graph is bipartite if there exists a bipartition of the vertices s.t. (such that) there are no edges within the partitions.

Theorem. A graph is bipartite if it has no cycles of odd lenght.



*K*_{3,2}

Trees (graphs)





Def. Tree is a connected graph with no cycles.

The following are equivalent:
1) *G* is a tree;
2) *G* has no cycles and *n-1* edges;
3) *G* is connected and has *n-1* edges;

Bipartite graphs

Def. A graph is bipartite if there exists a bipartition of the vertices s.t. (such that) there are no edges within the partitions.

Theorem. A graph is bipartite if it has no cycles of odd lenght.

One way is easy...









Counting edges

A connected graph with n vertices has:

• at least *n-1* edges

• at most
$$\binom{n}{2} = \frac{n(n-1)}{2}$$
 edges





Digression:



1.How many (distinct) 3-regular graphs with 4 vertices are there?2.How many 3- regular graphs with 5 vertices are there?3.How many complete bipartite graphs with 4 vertices are there?

(we only consider connected undirected graphs)





3-regular graphs are also called cubic graphs...



0, 1, 2, 5, 19, 85, 509, 4060, 41301, ... (OEIS A002851).

http://mathworld.wolfram.com/CubicGraph.html





Water, Gas and Electricity



Connect each house to source... no lines crossing!

Planar graphs





http://www.archimedes-lab.org/How_to_Solve/Water_gas.html

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?

Planar graphs



Planar graphs can be drawn (on a plane) without intersecting edges. Euler proved the following relationship for planar graphs: |V| - |E| + r = 2; where *r* stands for the *faces:* "regions" the plane is cut into, including the outermost.

Kuratowski: A <u>finite graph</u> is planar <u>if and only if</u> it does not contain a <u>subgraph</u> that is a <u>subdivision</u> of the <u>complete graph</u> K_5 or the <u>complete bipartite graph</u> $K_{3,3}$

Explain a bit...

Directed graphs



Definition. A directed graph G - a digraph - is an ordered pair (V,E) where

- V = V(G) is the set of vertices (or nodes)
- *E*=*E*(*G*) is the set of directed edges (or arrows, or arcs)

directed edges e=(u,v) are ordered pairs of vertices, <u>from u to v</u> we also say the edge begins in <u>u</u> and ends in <u>v</u>, <u>u</u> precedes v, or v follows u

Loops possible. Parallel edges not (anti-parallel yes!).



$$E = \{ (p, s), (p, t), (q, u), (r, p), (s, p), (s, q), (t, q), (t, r), (u, s), (u, u) \}$$



Caveat: mistakes and inconsistencies happen

In example 9.1 in Schaum (p 202), graph (a) contains two parallel arrows: (B, A) appears twice in the set E (G). That is not in line with the definition of a set. So this graph is actually a directed multigraaf. Oh well. Note that for defining a directed or undirected multigraph for E, we could use the concept of a multiset. In the book and the lecture, multigraphs (directed or undirected) are used informally.
out-degree outdeg(v): number of outbound edges
in-degree indeg(v): number of inbound edges

Source: vertex v with indeg(v)=0. Sink: vertex v with outdeg(v)=0.



from...

		to					
	p	q	r	S	t	u	
)	(0	0	0	1	1	0)	
1	0	0	0	0	0	1	
	1	0	0	0	0	0	
5	1	1	0	0	0	0	
t	0	1	1	0	0	0	
1	$\left(0 \right)$	0	0	1	0	1)	



out-degree *outdeg(v)*: number of outbound edges in-degree *indeg(v)*: number of inbound edges

Source: vertex v with indeg(v)=0. Sink: vertex v with outdeg(v)=0.



from...





to...



out-degree outdeg(v): number of outbound edges
in-degree indeg(v): number of inbound edges

Source: vertex v with indeg(v)=0. Sink: vertex v with outdeg(v)=0.





"number of starts" = "number of ends"



directed path: a sequence $v_1, e_1, v_2, e_2, \dots, v_n$, with $e_k = (v_k, v_{k+1})$

Lenght of path = number of (directed) edges in path (n)

simple: differing vertices
cycle: closed path (first vertex = last vertex)
trail: differing edges
circuit: closed trail

spanning path: passes all vertices (recall Hamilton)

semipath: undirected path; path in the underlying undirected graph ($e_k = (v_k, v_{k+1})$ OR $e_k = (v_{k+1}, v_k)$)



path: $q \rightarrow u \rightarrow s \rightarrow p \rightarrow t \rightarrow r$ *semipath :* $p \rightarrow s \rightarrow q \leftarrow t \rightarrow r$





Caveat: mistakes and inconsistencies happen

In Schaum, the term cycle is not dealt with very consistently. According to the definition, loops and a closed path such as s, p, s in the example of the previous previous would be cycles. After all, Schaum does not limit the length of the closed path, as was the case with undirected graph. However, in the example on page 221 (problem 9.1 (d)), Z, W, Z is not counted as a cycle. Oh, well.

Digraphs and connectedness



Definition. A digraph is strongly connected if every pair of vertices is connected by a directed path.

Definition. A digraph is weakly connected if every pair of vertices is connected by a semipath.

Theorem 9.2. a) strongly connected if and only a closed spanning path exists b) weakly connected if and only if a spanning semipath exists

Theorem 9.3. A directed graph G without cycles has a source and a sink.

Theorem 9.3. If G is a directed graph without cycles, then there exists a topological ordering of G (and converse)

Digraphs: topological ordering



A topological ordering *(topological sorting*) of a directed graph G = (V, E) is a sequence (an enumeration) $v_1, v_2, ..., v_n$ of all the vertices of of G such that $(v_i, v_j) \in E$, $\Rightarrow i < j$

Or: you can draw the vertices of the graph in such a configuration that the arrows always point left to right.



a topological ordering: 7,5,11,2,3,10,8,9

Digraphs: topological ordering



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Or: you can draw the vertices of the graph in such a configuration that the arrows always point left to right.





Rock, Paper, Scissors, Lizard, Spock?