



**UNSW**  
SYDNEY

# COMP9020

Foundations of Computer Science

Lecture 8: Graph Theory

# Outline

Motivation and Applications

Terminology and Notation

Graph Traversals

Properties of Graphs

Feedback

# Outline

Motivation and Applications

Terminology and Notation

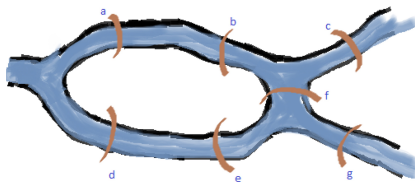
Graph Traversals

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Feedback

# Graph theory: Historical Motivation

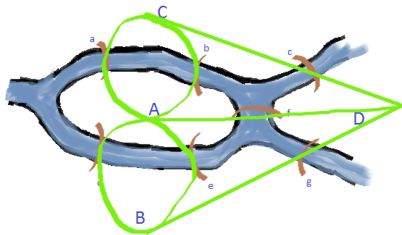
Bridges of Königsberg problem



Can you find a route which crosses each bridge exactly once?

# Graph theory: Historical Motivation

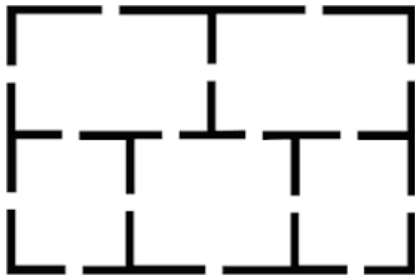
## Bridges of Königsberg problem



Can you find a route which crosses each bridge exactly once?

# Graph theory: Motivation

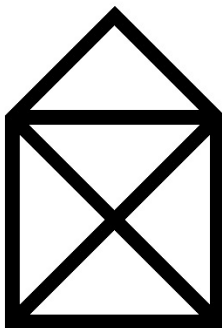
Five rooms problem



Can you find a route which passes through each door exactly once?

# Graph theory: Motivation

Crossed house problem



Can you draw this without taking your pen off the paper?

# Graph theory: Motivation

Three utilities problem



Can you connect all utilities to all houses without crossing connections?



# Graph theory: Motivation

The following table describes several subjects and the students taking them:

Potions	Charms	Herbology	Astronomy	Transfiguration
Harry	Ron	Harry	Hermione	Hermione
Ron	Luna	George	Neville	Fred
Malfoy	Ginny	Neville	Seamus	Luna

How many examination timeslots are needed so that no student has two (or more) exams at the same time?

# Graphs in Computer Science

## Examples

- ➊ The WWW can be considered a massive graph where the nodes are web pages and arcs are hyperlinks.
- ➋ The possible states of a program form a directed graph.
- ➌ Circuit components and their connections form a graph.
- ➍ Social networks can be viewed as a graph where the nodes are users and the edges are connections.
- ➎ The map of the earth can be represented as an undirected graph where edges delineate countries.

# Graphs in Computer Science

Applications of graphs in Computer Science are abundant, e.g.

- route planning in navigation systems, robotics
- optimisation, e.g. timetables, utilisation of network structures, bandwidth allocation
- compilers using “graph colouring” to assign registers to program variables
- circuit layout ([Untangle game](#))
- determining the significance of a web page (Google’s pagerank algorithm)
- modelling the spread of a virus in a computer network or news in social network

# Outline

Motivation and Applications

**Terminology and Notation**

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# Graphs

Terminology (the most common; there are many variants):

**Graph** — pair  $(V, E)$  where  $V$  – set of vertices (or nodes)  
 $E$  – set of edges

**Undirected graph:** Every edge  $e \in E$  is a two-element set of vertices, i.e.  $e = \{x, y\} \subseteq V$  where  $x \neq y$

**Directed graph:** Every edge (or arc)  $e \in E$  is an ordered pair of vertices, i.e.  $e = (x, y) \in V \times V$ , note  $x$  may equal  $y$ .

## NB

*Binary relations on finite sets correspond to directed graphs.  
Symmetric, antireflexive relations correspond to undirected graphs.*

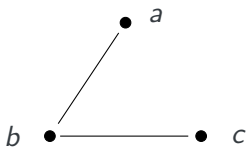
# Graph representations

Graph:

$$V = \{a, b, c\}$$

$$E = \{\{a, b\}, \{b, c\}\}$$

Pictorially:

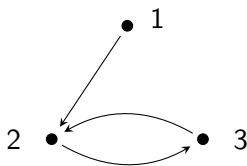


Directed graph:

$$V = \{1, 2, 3\}$$

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

Pictorially:



# Graph representations

Graph:

$$V = \{a, b, c\}$$

$$E = \{\{a, b\}, \{b, c\}\}$$

Adjacency matrix:

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

Directed graph:

$$V = \{1, 2, 3\}$$

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

Adjacency matrix:

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# Graph representations

Graph:

$$V = \{a, b, c\}$$

$$E = \{\{a, b\}, \{b, c\}\}$$

Adjacency list:

$a : b$

$b : a, c$

$c : b$

Directed graph:

$$V = \{1, 2, 3\}$$

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

Adjacency list:

$1 : 2$

$2 : 3$

$3 : 2$



# Graph representations

Graph:

$$V = \{a, b, c\}$$

$$E = \{\{a, b\}, \{b, c\}\}$$

Incidence matrix

(vertices=rows,  
edges=columns):

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

Directed graph:

$$V = \{1, 2, 3\}$$

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

Incidence matrix

(vertices=rows,  
edges=columns):

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

# Paths

- A **(directed) path** in a (directed) graph  $(V, E)$  is a sequence of edges that link up

$$v_0 \xrightarrow{\{v_0, v_1\}} v_1 \xrightarrow{\{v_1, v_2\}} \dots \xrightarrow{\{v_{n-1}, v_n\}} v_n$$

where  $e_i = \{v_{i-1}, v_i\} \in E$  (or  $e_i = (v_{i-1}, v_i) \in E$ )

- **length** of the path is the number of edges:  $n$   
neither the vertices nor the edges have to be all different
- Subpath of length  $r$ :  $(e_m, e_{m+1}, \dots, e_{m+r-1})$
- Path of length 0: single vertex  $v_0$
- **Connected set/graph (undirected)** — each pair of vertices joined by a path
- **Strongly connected set/graph (directed)** — each pair of vertices joined by a directed path in both directions

# Vertex Degrees (Undirected graphs)

- **Degree** of a vertex

$$\deg(v) = |\{ w \in V : \{v, w\} \in E \}|$$

i.e., the number of edges attached to the vertex

- **Regular graph** — all degrees are equal
- **Degree sequence**  $D_0, D_1, D_2, \dots, D_k$  of graph  $G = (V, E)$ , where  $D_i$  = no. of vertices of degree  $i$

## Question

*What is  $D_0 + D_1 + \dots + D_k$ ?*

## Fact

$\sum_{v \in V} \deg(v) = 2 \cdot |E|$ ; so the sum of vertex degrees is always even.

## Corollary

*There is an even number of vertices of odd degree.*

## Vertex Degrees (Directed graphs)

- **Out-degree** of a vertex

$$\text{outdeg}(v) = |\{ w \in V : (v, w) \in E \}|$$

i.e., the number of edges going out of the vertex

- **In-degree** of a vertex

$$\text{indeg}(v) = |\{ w \in V : (w, v) \in E \}|$$

i.e., the number of edges going in to the vertex

### Fact

$$\sum_{v \in V} \text{outdeg}(v) = \sum_{v \in V} \text{indeg}(v) = |E|.$$

# Exercises

## Exercises

RW: 6.1.13(a) Draw a connected, regular graph on four vertices, each of degree 2

RW: 6.1.13(b) Draw a connected, regular graph on four vertices, each of degree 3

RW: 6.1.13(c) Draw a connected, regular graph on five vertices, each of degree 3

RW: 6.1.14(a) Graph with 3 vertices and 3 edges

RW: 6.1.14(b) Two graphs each with 4 vertices and 4 edges

# Exercises

## NB

*We use the notation*

$n = v(G) = |V|$  for the no. of vertices of graph  $G = (V, E)$

$m = e(G) = |E|$  for the no. of edges of graph  $G = (V, E)$

## Exercises

RW: 6.1.20(a) Graph with  $e(G) = 21$  edges has a degree sequence  $D_0 = 0, D_1 = 7, D_2 = 3, D_3 = 7, D_4 = ?$   
Find  $v(G)$

RW: 6.1.20(b) How would your answer change, if at all, when  $D_0 = 6$ ?

# Cycles

Recall paths  $v_0 \xrightarrow{e_1} v_1 \xrightarrow{e_2} \dots \xrightarrow{e_n} v_n$

- *simple path* —  $e_i \neq e_j$  for all edges of the path ( $i \neq j$ )
- *closed path* —  $v_0 = v_n$
- **cycle** — closed path, all other  $v_i$  pairwise distinct and  $\neq v_0$
- *acyclic path* —  $v_i \neq v_j$  for all vertices in the path ( $i \neq j$ )

## NB

- 1  $C = (e_1, \dots, e_n)$  is a cycle iff removing any single edge leaves an acyclic path. (Show that the 'any' condition is needed!)
- 2  $C$  is a cycle if it has the same number of edges and vertices and no proper subpath has this property.  
(Show that the 'subpath' condition is needed, i.e., there are graphs  $G$  that are **not** cycles and  $|E_G| = |V_G|$ ; every such  $G$  must contain a cycle!)

# Trees

- **Acyclic graph** — graph that doesn't contain any cycle
- **Tree** — connected acyclic [undirected]graph
- A graph is acyclic *iff* it is a *forest* (collection of disjoint trees)

## NB

*Graph  $G$  is a tree iff*

- $\Leftrightarrow$  *it is acyclic and  $|V_G| = |E_G| + 1$ .  
(Show how this implies that the graph is connected!)*
- $\Leftrightarrow$  *there is exactly one simple path between any two vertices.*
- $\Leftrightarrow$   *$G$  is connected, but becomes disconnected if any single edge is removed.*
- $\Leftrightarrow$   *$G$  is acyclic, but has a cycle if any single edge on already existing vertices is added.*



# Trees

A tree with one vertex designated as its *root* is called a *rooted tree*. It imposes an ordering on the edges: 'away' from the root — from parent nodes to children. This defines a *level number* (or: *depth*) of a node as its distance from the root.

Another very common notion in Computer Science is that of a *DAG* — a *directed, acyclic graph*.

## Exercise (Supplementary)

### Exercises

RW: 6.7.3 (Supp) Tree with  $n$  vertices,  $n \geq 3$ .

Always true, false or could be either?

- (a)  $e(T) \stackrel{?}{=} n$
- (b) at least one vertex of degree exactly 2?
- (c) at least two  $v_1, v_2$  s.t.  $\deg(v_1) = \deg(v_2)$
- (d) exactly one path from  $v_1$  to  $v_2$

# Special Graphs

- **Complete graph**  $K_n$

$n$  vertices, all pairwise connected,  $\frac{n(n-1)}{2}$  edges.

- **Complete bipartite graph**  $K_{m,n}$

Has  $m + n$  vertices, partitioned into two (disjoint) sets, one of  $n$ , the other of  $m$  vertices.

All vertices from different parts are connected; vertices from the same part are disconnected. No. of edges is  $m \cdot n$ .

- **Complete  $k$ -partite graph**  $K_{m_1, \dots, m_k}$

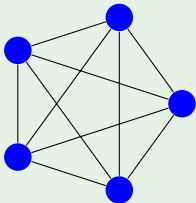
Has  $m_1 + \dots + m_k$  vertices, partitioned into  $k$  disjoint sets, respectively of  $m_1, m_2, \dots$  vertices.

No. of edges is  $\sum_{i < j} m_i m_j = \frac{1}{2} \sum_{i \neq j} m_i m_j$

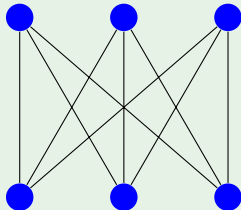
- These graphs generalise the complete graphs  $K_n = K_{\underbrace{1, \dots, 1}_n}$

## Example

$K_5$  :



$K_{3,3}$  :



# Graph Isomorphisms

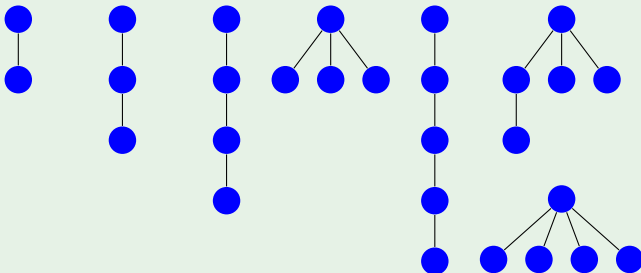
$\phi : G \longrightarrow H$  is a *graph isomorphism* if

- (i)  $\phi : V_G \longrightarrow V_H$  is a bijection
- (ii)  $(x, y) \in E_G$  iff  $(\phi(x), \phi(y)) \in E_H$

Two graphs are called *isomorphic* if there exists (at least one) isomorphism between them.

## Example

All nonisomorphic trees on 2, 3, 4 and 5 vertices.



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# Graph exploration

Often it is useful to “explore” a graph: visit vertices in some order and examine each one.

- **Search:** Explore the graph until a particular vertex is discovered.
- **Traversal:** Examine all the vertices of the graph

# Graph exploration

Two common graph exploration algorithms are **Depth-first search/traversal** (DFS) and **Breadth-first search/traversal** (BFS).

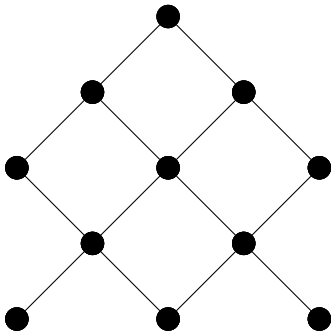
Both follow the same structure:

- Examine a vertex  $v$
- Discover new vertices (neighbours of  $v$ )
- Move to the next discovered but not yet examined vertex
- DFS: Examine vertices by most recently discovered
- BFS: Examine vertices by least recently discovered

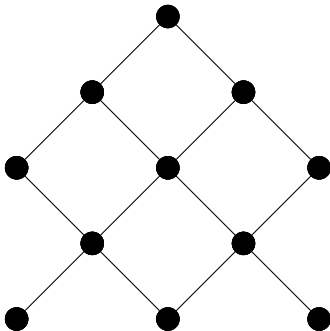


# DFS vs BFS

DFS



BFS



# Special types of traversals

Often we are interested in traversals that have a certain property.  
For example:

- Eulerian traversals: Visit all the edges exactly once
- Hamiltonian traversals: Visit all the vertices exactly once

## NB

*In any given graph, these traversals may or may not exist.  
Establishing the existence of such a traversal (decision problem) vs  
finding one if it exists (search problem) are subtly different  
problems.*

# Edge Traversal

## Definition

- **Euler path** — path containing every edge exactly once
- **Euler circuit** — closed Euler path

## Characterisations

- $G$  (connected) has an Euler circuit iff  $\deg(v)$  is even for all  $v \in V$ .
- $G$  (connected) has an Euler path iff either it has an Euler circuit (above) or it has exactly two vertices of odd degree.

## NB

- *These characterisations apply to graphs with loops as well*
- *For directed graphs the condition for existence of an Euler circuit is  $\text{indeg}(v) = \text{outdeg}(v)$  for all  $v \in V$*

# Exercises

## Exercises

**RW: 6.2.11** Construct a graph with vertex set  $\{0, 1\} \times \{0, 1\} \times \{0, 1\}$  and with an edge between vertices if they differ in exactly two coordinates.

- (a) How many components does this graph have?
- (b) How many vertices of each degree?
- (c) Euler circuit?

**RW: 6.2.12** As Ex. 6.2.11 but with an edge between vertices if they differ in two or three coordinates.

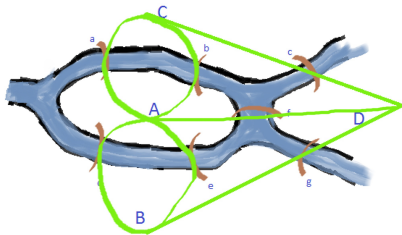
# Exercises

## Exercises

RW: 6.2.14 Which complete graphs  $K_n$  have an Euler circuit?  
When do bipartite, 3-partite complete graphs have an Euler circuit?

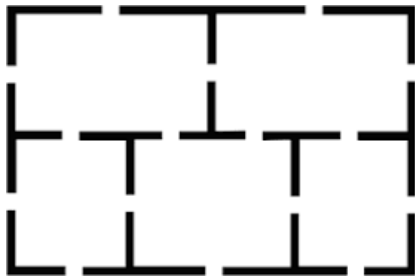
# Bridges of Königsberg

## Bridges of Königsberg problem



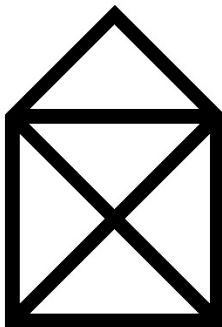
Can you find a route which crosses each bridge exactly once? No!

## Five rooms problem



Can you find a route which passes through each door exactly once?  
No!

## Crossed house problem



Can you draw this without taking your pen off the paper? Yes!



# Vertex Traversal

## Definition

- **Hamiltonian path** visits every vertex of graph exactly once
- **Hamiltonian cycle** visits every vertex exactly once except the last one, which duplicates the first

## NB

*Finding such a cycle, or proving it does not exist, is a difficult problem — the worst case is NP-complete.*

## Examples (when the cycle exists)

- All five regular polyhedra (verify!)
- $n$ -cube; Hamiltonian circuit = *Gray code*
- $K_m$  for all  $m$ ;  $K_{m,n}$  iff  $m = n$ ;  $K_{a,b,c}$  iff  $a, b, c$  satisfy the triangle inequalities:  $a + b \geq c$ ,  $a + c \geq b$ ,  $b + c \geq a$
- Knight's tour on a chessboard (incl. rectangular boards)

Examples when a Hamiltonian cycle does not exist are much harder to construct.

Also, given such a graph it is nontrivial to verify that indeed there is no such a cycle: there is nothing obvious to specify that could assure us about this property.

In contrast, if a cycle is given, it is immediate to verify that it is a Hamiltonian cycle.

These situations demonstrate the often enormous discrepancy in difficulty of 'proving' versus (simply) 'checking'.

# Exercise

## Exercise

RW: 6.5.5(a) How many Hamiltonian cycles does  $K_{n,n}$  have?

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# Colouring

Informally: assigning a “colour” to each vertex (e.g. a node in an electric or transportation network) so that the vertices connected by an edge have different colours.

Formally: A mapping  $c : V \longrightarrow [1 \dots n]$  such that for every  $e = (v, w) \in E$

$$c(v) \neq c(w)$$

The minimum  $n$  sufficient to effect such a mapping is called the **chromatic number** of a graph  $G = (E, V)$  and is denoted  $\chi(G)$ .

## NB

*This notion is extremely important in operations research, esp. in scheduling.*

*There is a dual notion of ‘edge colouring’ — two edges that share a vertex need to have different colours. Curiously enough, it is much less useful in practice.*

# Properties of the Chromatic Number

- $\chi(K_n) = n$
- If  $G$  has  $n$  vertices and  $\chi(G) = n$  then  $G = K_n$

## Proof.

Suppose that  $G$  is 'missing' the edge  $(v, w)$ , as compared with  $K_n$ . Colour all vertices, except  $w$ , using  $n - 1$  colours. Then assign to  $w$  the same colour as that of  $v$ . □

- If  $\chi(G) = 1$  then  $G$  is totally disconnected: it has 0 edges.
- If  $\chi(G) = 2$  then  $G$  is bipartite.
- For any tree  $\chi(T) = 2$ .
- For any cycle  $C_n$  its chromatic number depends on the parity of  $n$  — for  $n$  even  $\chi(C_n) = 2$ , while for  $n$  odd  $\chi(C_n) = 3$ .

# Cliques

Graph  $(V', E')$  *subgraph* of  $(V, E)$  —  $V' \subseteq V$  and  $E' \subseteq E$ .

## Definition

A **clique** in  $G$  is a *complete* subgraph of  $G$ . A clique of  $k$  nodes is called *k-clique*.

The size of the largest clique is called the *clique number* of the graph and denoted  $\kappa(G)$ .

## Theorem

$$\chi(G) \geq \kappa(G).$$

## Proof.

Every vertex of a clique requires a different colour, hence there must be at least  $\kappa(G)$  colours. □

However, this is the only restriction. For any given  $k$  there are graphs with  $\kappa(G) = k$ , while  $\chi(G)$  can be arbitrarily large.

## NB

*This fact (and such graphs) are important in the analysis of parallel computation algorithms.*

- $\kappa(K_n) = n$ ,  $\kappa(K_{m,n}) = 2$ ,  $\kappa(K_{m_1, \dots, m_r}) = r$ .
- If  $\kappa(G) = 1$  then  $G$  is totally disconnected.
- For a tree  $\kappa(T) = 2$ .
- For a cycle  $C_n$   
 $\kappa(C_3) = 3$ ,  $\kappa(C_4) = \kappa(C_5) = \dots = 2$

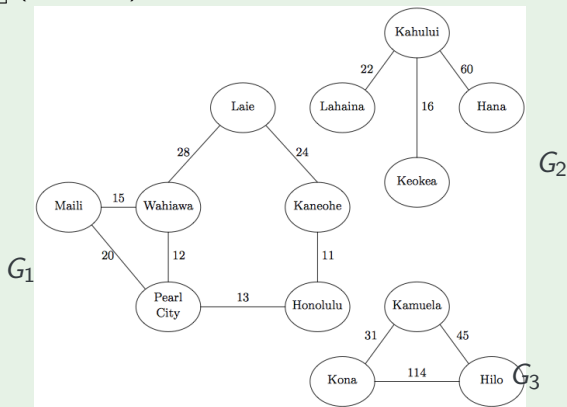
The difference between  $\kappa(G)$  and  $\chi(G)$  is apparent with just  $\kappa(G) = 2$  — this does not imply that  $G$  is bipartite. For example, the cycle  $C_n$  for any odd  $n$  has  $\chi(C_n) = 3$ .



# Exercise

## Exercise

RW: 9.10.1 (Ullmann)



$\chi(G_i)? \kappa(G_i)?$

# Exercise

## Exercise

RW: 9.10.3 (Ullmann) Let  $G = (V, E)$  be an undirected graph. What inequalities must hold between

- the maximal  $\deg(v)$  for  $v \in V$
- $\chi(G)$
- $\kappa(G)$

# Timetable scheduling

The following table describes several subjects and the students taking them:

Potions	Charms	Herbology	Astronomy	Transfiguration
Harry	Ron	Harry	Hermione	Hermione
Ron	Luna	George	Neville	Fred
Malfoy	Ginny	Neville	Seamus	Luna

How many examination timeslots are needed so that no student has two (or more) exams at the same time? 3

# Planar Graphs

## Definition

A graph is **planar** if it can be embedded in a plane without its edges intersecting.

## Theorem

*If the graph is planar it can be embedded (without self-intersections) in a plane so that all its edges are straight lines.*

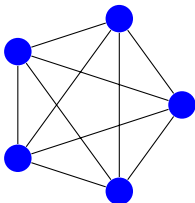
## NB

*This notion and its related algorithms are extremely important to VLSI and visualizing data.*

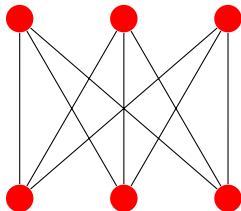
# Nonplanar graphs

Two minimal nonplanar graphs

$K_5$  :



$K_{3,3}$  :



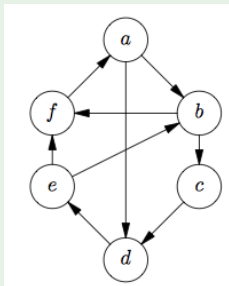
Try out  $K_5$

Try out  $K_{3,3}$

# Exercise

## Exercise

RW: 9.10.2 (Ullmann)



Is (the undirected version of) this graph planar?

Try it out

# Three utilities problem



Can you connect all utilities to all houses without crossing connections? No!

# Testing for nonplanarity

## Theorem

*If graph  $G$  contains, as a subgraph, a nonplanar graph, then  $G$  itself is nonplanar.*

For a graph, *edge subdivision* means to introduce some new vertices, all of degree 2, by placing them on existing edges.



We call such a derived graph a *subdivision* of the original one.

## Theorem

*If a graph is nonplanar then it must contain a subdivision of  $K_5$  or  $K_{3,3}$ .*



# More nonplanar graphs

## Theorem

$K_n$  for  $n \geq 5$  is nonplanar.

## Proof.

It contains  $K_5$ : choose any five vertices in  $K_n$  and consider the subgraph they define. □

## Theorem

$K_{m,n}$  is nonplanar when  $m \geq 3$  and  $n \geq 3$ .

## Proof.

They contain  $K_{3,3}$  — choose any three vertices in each of two vertex parts and consider the subgraph they define. □

# Exercise

## Exercise

Are all  $K_{m,1}$  planar?

# Exercise

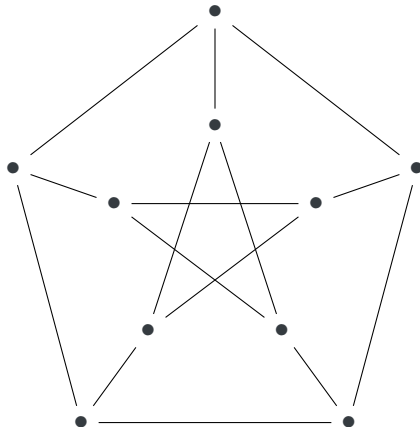
## Exercise

Are all  $K_{m,2}$  planar?

# Testing nonplanarity

NB

*Finding a 'basic' nonplanar obstruction is not always simple*



It contains a subdivision  $K_{3,3}$ , but not  $K_5$ .

# Strategy for finding a subdivision

To show  $G$  contains a subdivision of  $H$ :

## Strategy I:

- Start at  $H$
- Perform the following operations as many times as you need:
  - ❶ Subdivide an edge
  - ❷ Add a vertex
  - ❸ Add an edge
- Finish with  $G$

## NB

- Each operation increases  $|V| + |E|$
- Can do all (i) first, then all (ii), then all (iii)

# Strategy for finding a subdivision

To show  $G$  contains a subdivision of  $H$ :

## Strategy II:

- Start at  $G$
- Perform the following operations as many times as you need:
  - i Delete an edge
  - ii Delete a vertex (and all adjacent edges)
  - iii Replace a vertex of degree 2 with an edge connecting its neighbours (contracting a vertex)
- Finish with  $H$

## NB

- *Each operation decreases  $|V| + |E|$*
- *Can do all (i) first, then all (ii), then all (iii)*

Showing a graph does not contain a subdivision

### Question

*What does not change when performing the operations?*

# Outline

Motivation and Applications

Terminology and Notation

Graph Traversals

Properties of Graphs

**Feedback**



# Weekly Feedback

I would appreciate any comments/suggestions/requests you have on this week's lectures.



<https://forms.office.com/r/xKKrxYMRn9>