

Graph $G = \langle V, E \rangle$

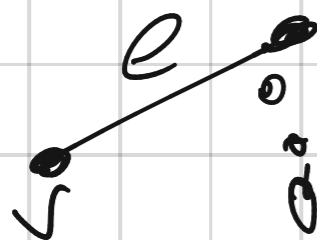
- V : vertices

- E : edges

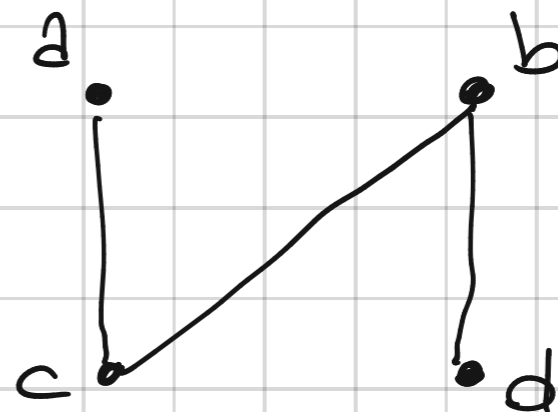
$$E \subseteq V \times V$$

$$(v, w) \in E \Rightarrow (w, v) \in E$$

Undirected graph



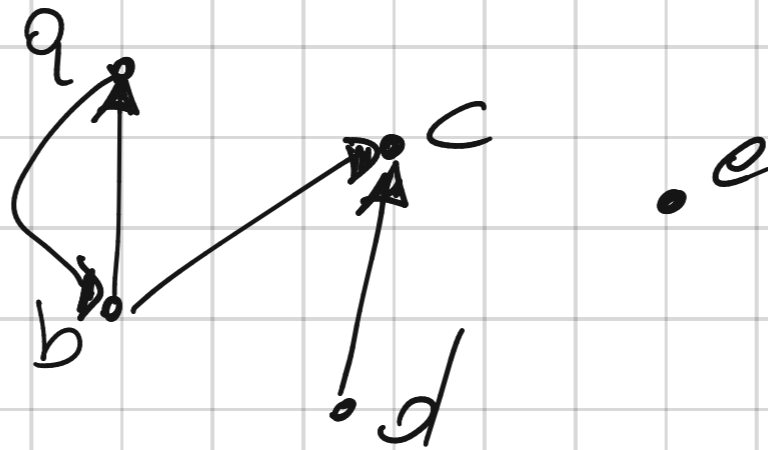
v incident on e



Graph $G = \langle V, A \rangle$

V : vertices

A : arcs $A \subseteq V \times V$



e : isolated vertex

Graph $G = \langle V, E \rangle$

$|V|: n$

$|E|: m$

vertex encoded with $\mathcal{O}(\log n)$ bit

Access to a vertex in $\mathcal{O}(s)$ time

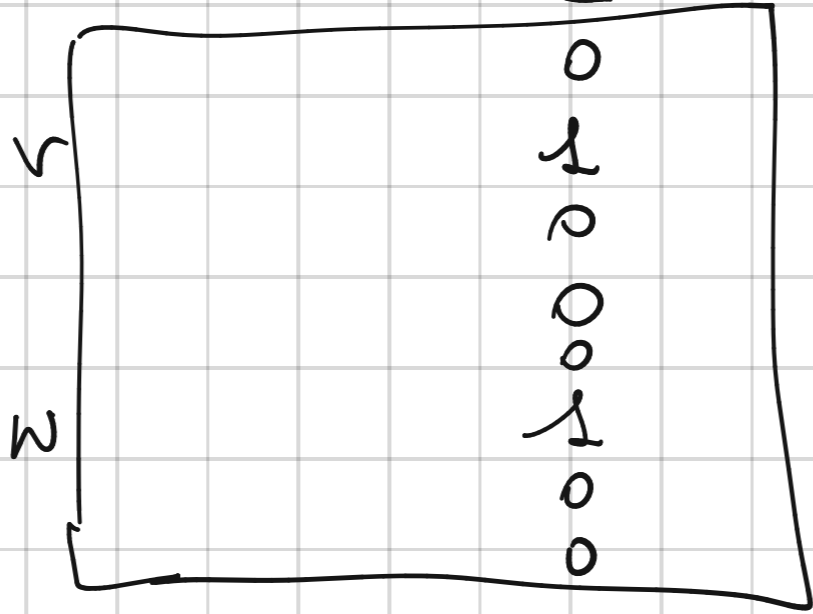
Graph Representations

- Adjacency Matrix $M[v, w]$ $\mathcal{O}(n^2)$ space
 - given a vertex v , find edges incident on v
 $\mathcal{O}(n)$ time
- Adjacency lists $L[v]$
 - for each vertex v , $L[v]$ is the list of edges incident on v
 - given a pair of vertices v, w , is $(v, w) \in E$?
 $\mathcal{O}(|N(v)|)$ time

• Incidence Matrix

$[v, e]$

$\mathcal{O}(nm)$ space



Special graphs

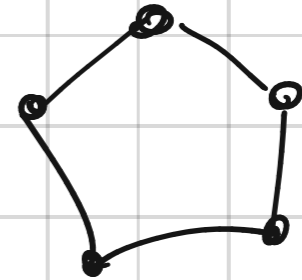
K_m : complete graph on m vertices

$K_{n,m}$: two sets A, B with $|A|=n, |B|=m$
and all possible edges in $A \times B$

P_n : simple path on n vertices P_4



C_n : simple cycle on n vertices C_5



Subgraph

$$G = \langle V, E \rangle$$

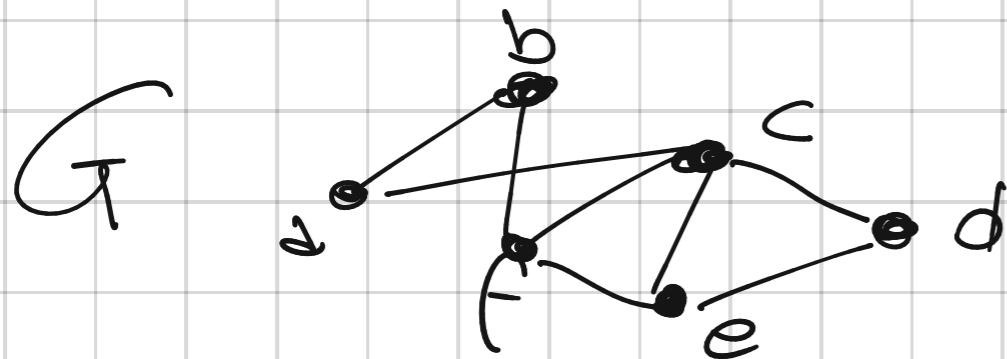
$$G_1 = \langle V_1, E_1 \rangle$$

G_1 is **subgraph** of G if $V_1 \subseteq V$ and $E_1 \subseteq E$

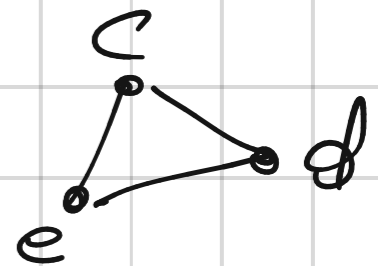
Induced subgraph $G|W$ with $U \subseteq V$

$$G = \langle V, E \rangle$$

$$G|W = \langle W, E \cap (W \times W) \rangle$$



$G|_{\{c,d,e,f\}}$



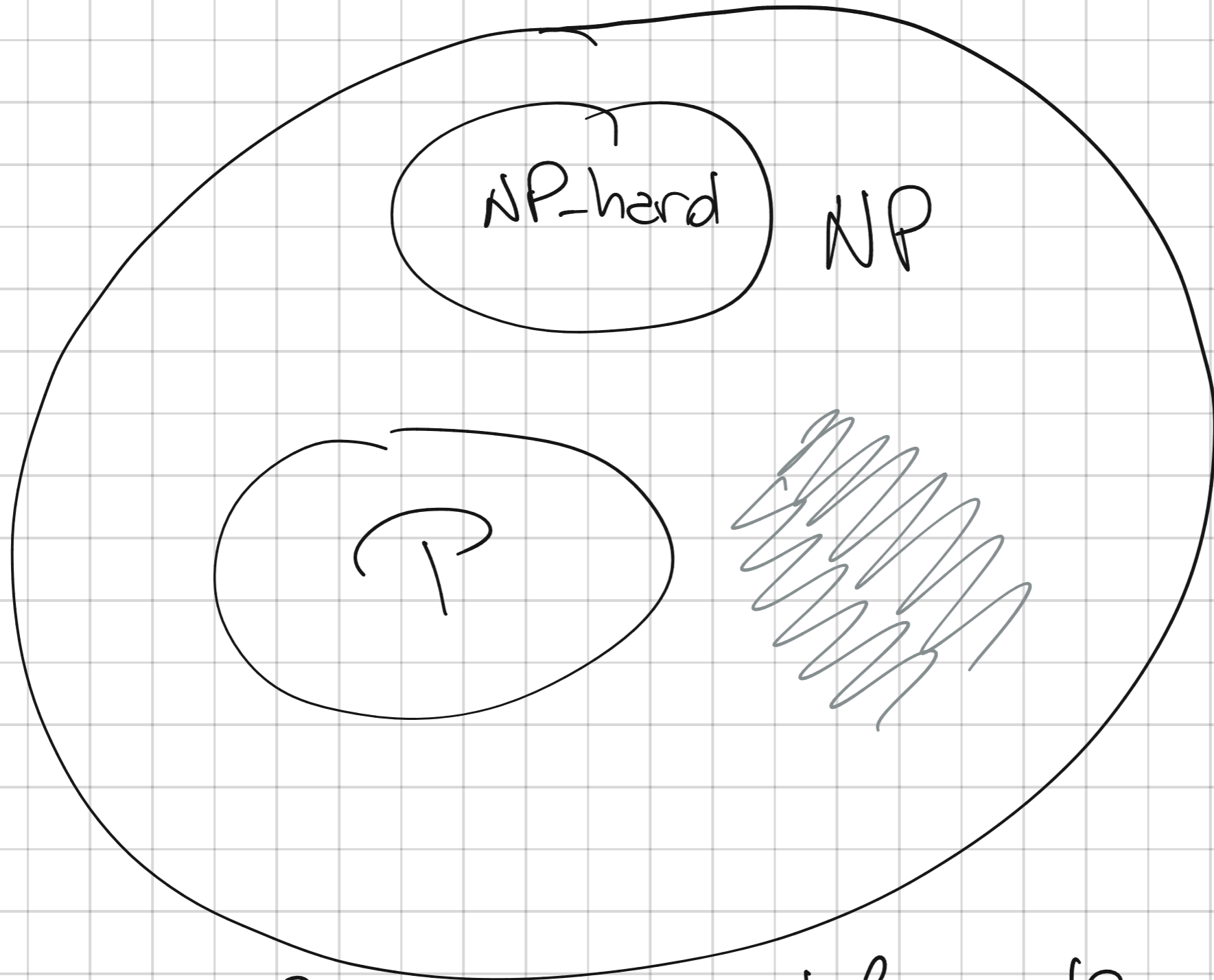
* Isomorphism

$$G_1 = \langle V_1, E_1 \rangle \quad G_2 = \langle V_2, E_2 \rangle$$

$$\varphi: V_1 \rightarrow V_2 \text{ such that } (\varphi(v), \varphi(w)) \in E_2 \Leftrightarrow (v, w) \in E_1$$

Automorphism

$$\text{if } G_1 = G_2$$



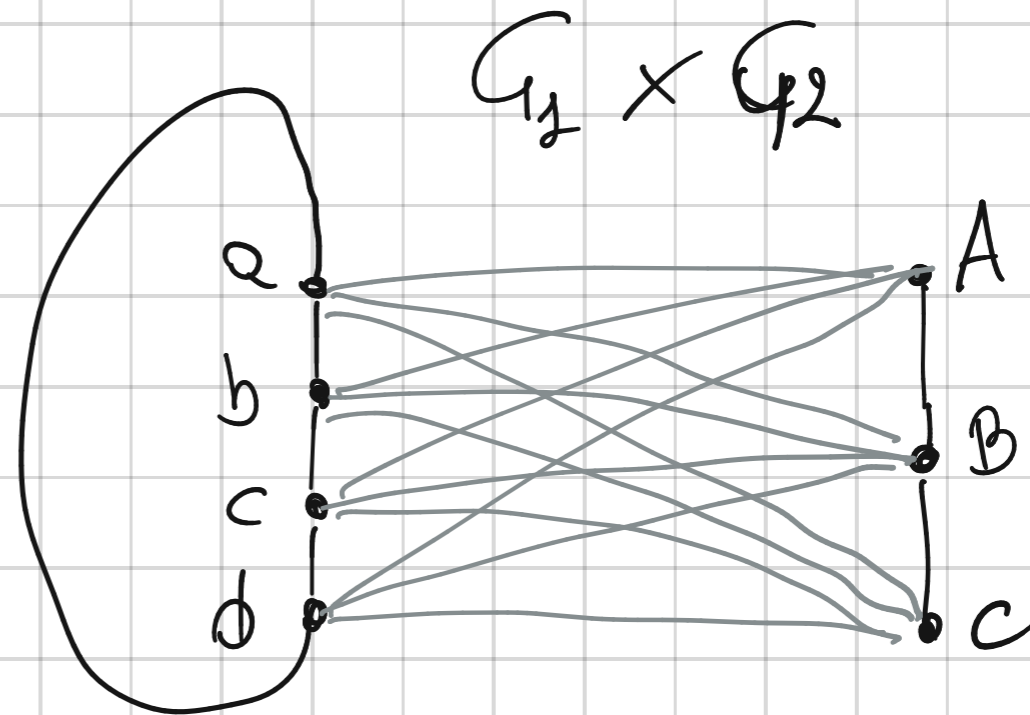
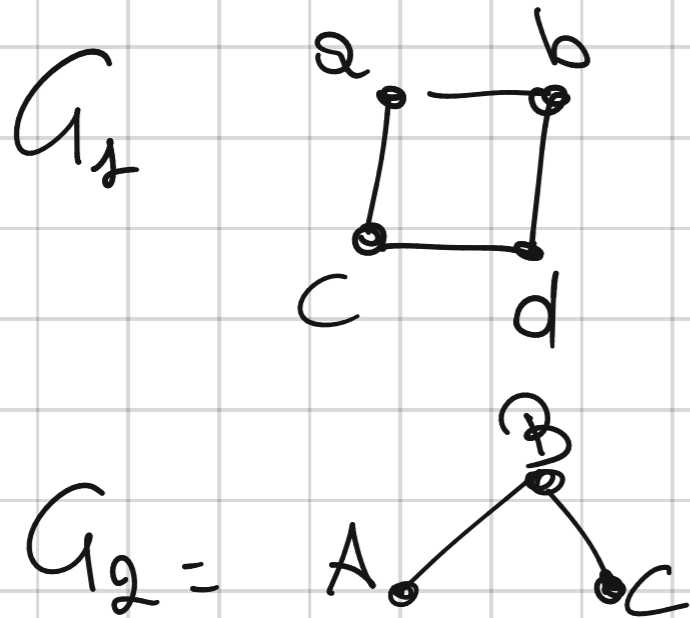
$NP \supset P \Rightarrow \exists$ Problem NP-intermediate

Product

$$G_1 = \langle V_1, E_1 \rangle$$

$$G_2 = \langle V_2, E_2 \rangle$$

$$G_1 \times G_2 = \langle V_1 \cup V_2, E_1 \cup E_2 \cup (V_1 \times V_2) \rangle$$



Complement

$$G = \langle V, E \rangle$$

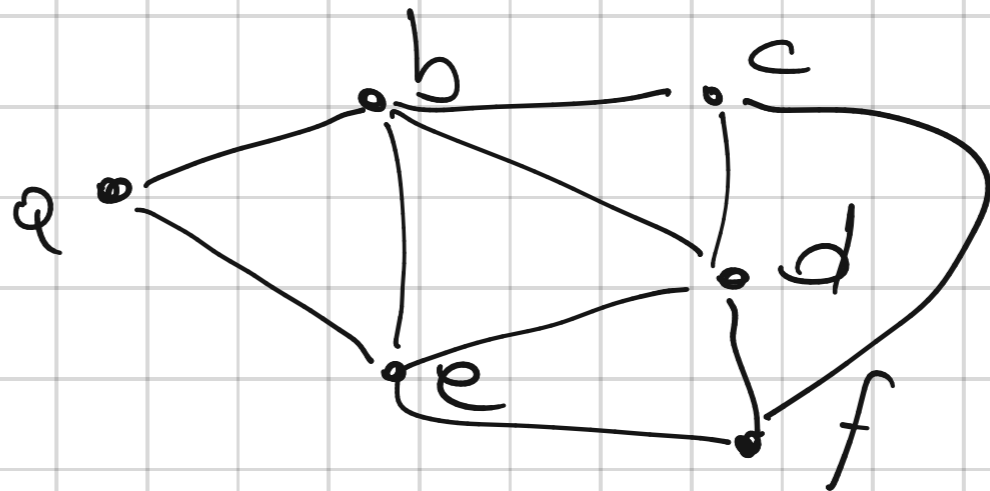
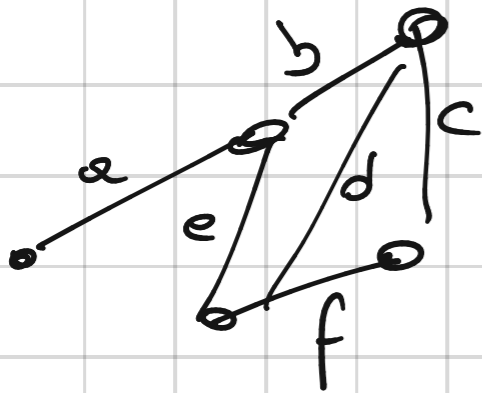
$$\overline{G} = \langle V, V \times V - E \rangle$$

Line graph

$$L(G)$$

$$G = \langle V, E \rangle$$

$L(G) = \langle E, \{(e_1, e_2) \text{ such that } e_1 \text{ and } e_2 \text{ share an endpoint in } G\} \rangle$



Neighborhood

$$N(v) = \{w : (v, w) \in E\}$$

$$N^+(v) = \{w : (v, w) \in A\}$$

$$N^-(v) = \{w : (w, v) \in A\}$$

Directed graphs

$$|N(v)| = \text{degree}$$

k -Regular if $|N(v)| = k \quad \forall v \in V$

Exercise

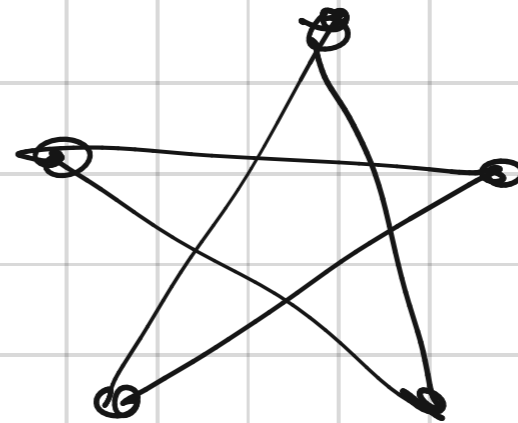
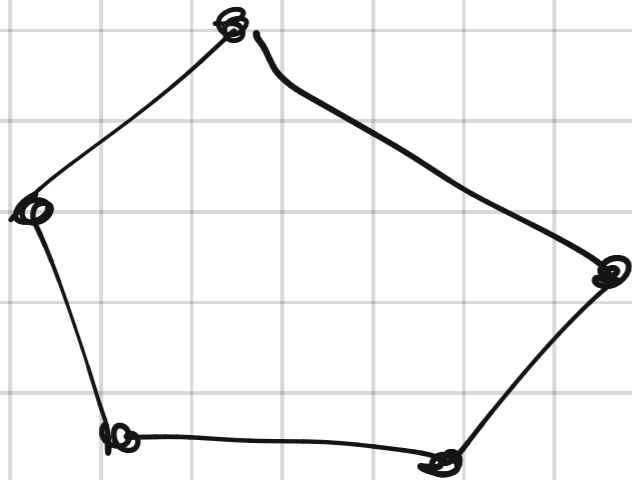
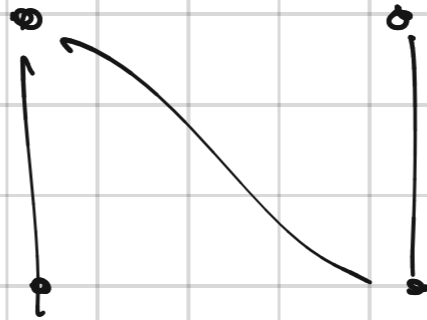
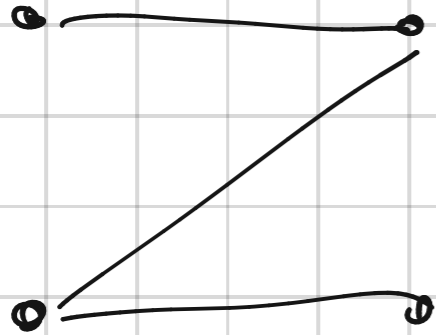
Find a graph G that is the complement of itself.

Ex 2

Find a 3-regular (cubic) graph that is the complement of itself

Exercise

$$G = \overline{G}$$



Exercise 2

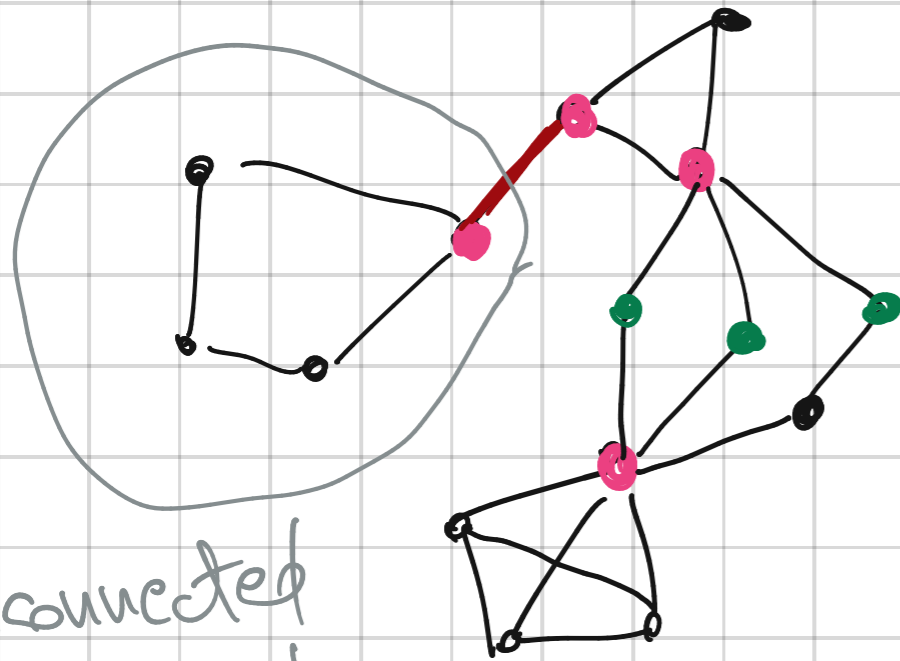
1) Cubic graph has an even number of vertices (n)

2) $v \in V$ has 3 neighbors and $n-4$ non-neighbors

(v itself cannot be a neighbor)

$n-4$ is even $\neq 3$

Connected graph



biconnected
component

• articulation point / cut vertex

— bridge

• • • cutset (of size 3)

Connectivity \leq min degree

Connectivity = min size of a cutset

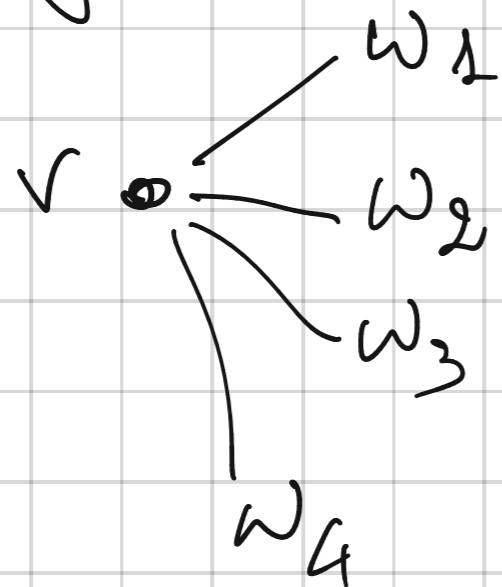
Ex

1) Prove that $\text{connectivity} \leq \text{min degree}$

2) Find a graph with $\text{connectivity} \ll \text{min degree}$

Ex 1

Let v be a vertex with smallest neighborhood.

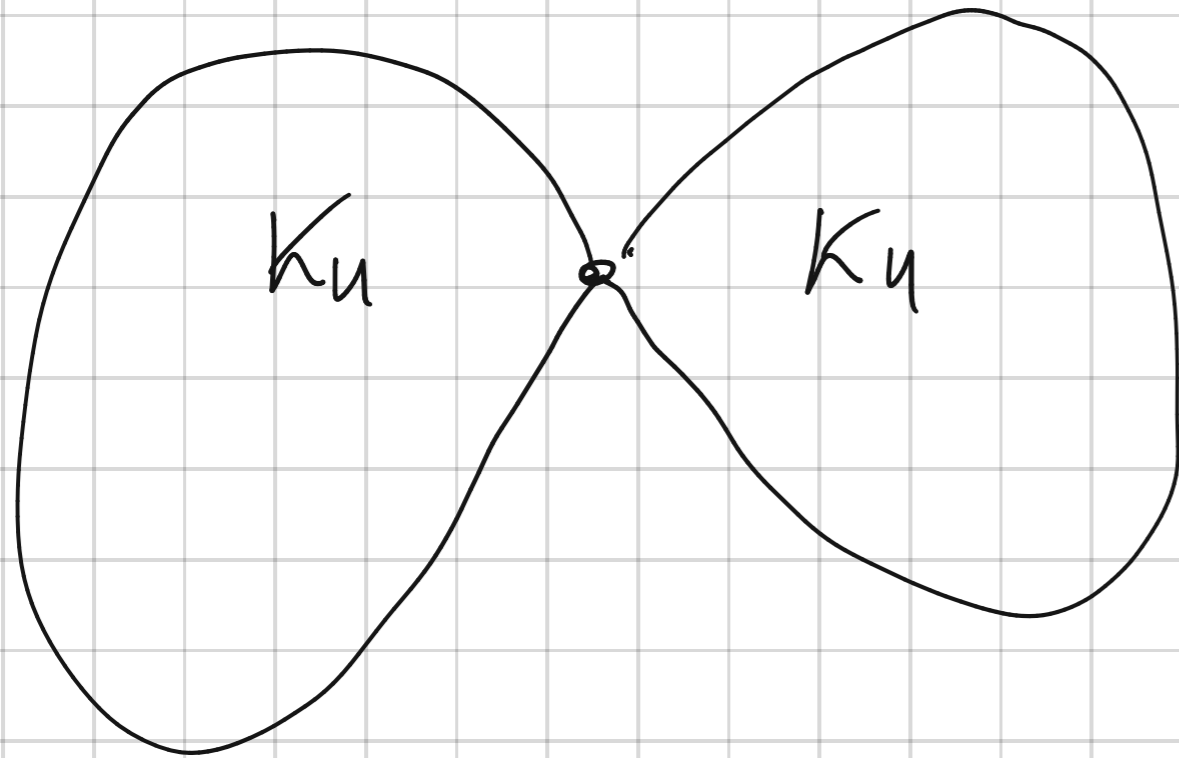


Remove all w_i



v is isolated

EX2



Two K_n sharing a vertex

Tree

- acyclic and connected
- minimally connected
- maximally acyclic

Depth-first

Breadth-first visits

- Compute connected components
- Compute biconnected components
- Topological sort
- Shortest path

Depth-first visit (DFS)

L empty list (unvisited vertices)

Pick any unvisited vertex v

Visit(v)

Visit(v)

Add v to the end of L

For each unvisited w such that $(v, w) \in E$

Visit(w)

Breadth-first visit (BFS)

visit(v)

Add v to the end of L (if v is not in L)

$W :=$ set of unvisited vertex w s.t. $(v, w) \in E$

For each $w \in W$

Add w to the end of L

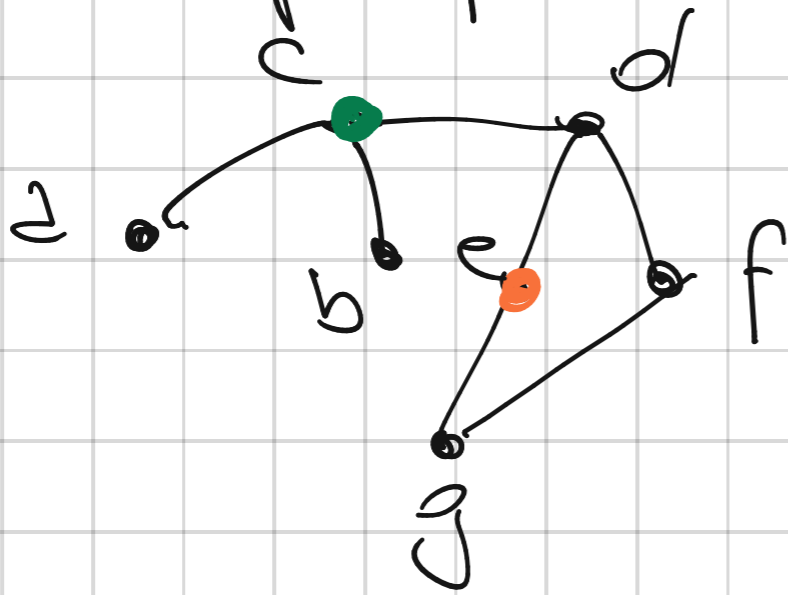
For each $w \in W$

visit(w)

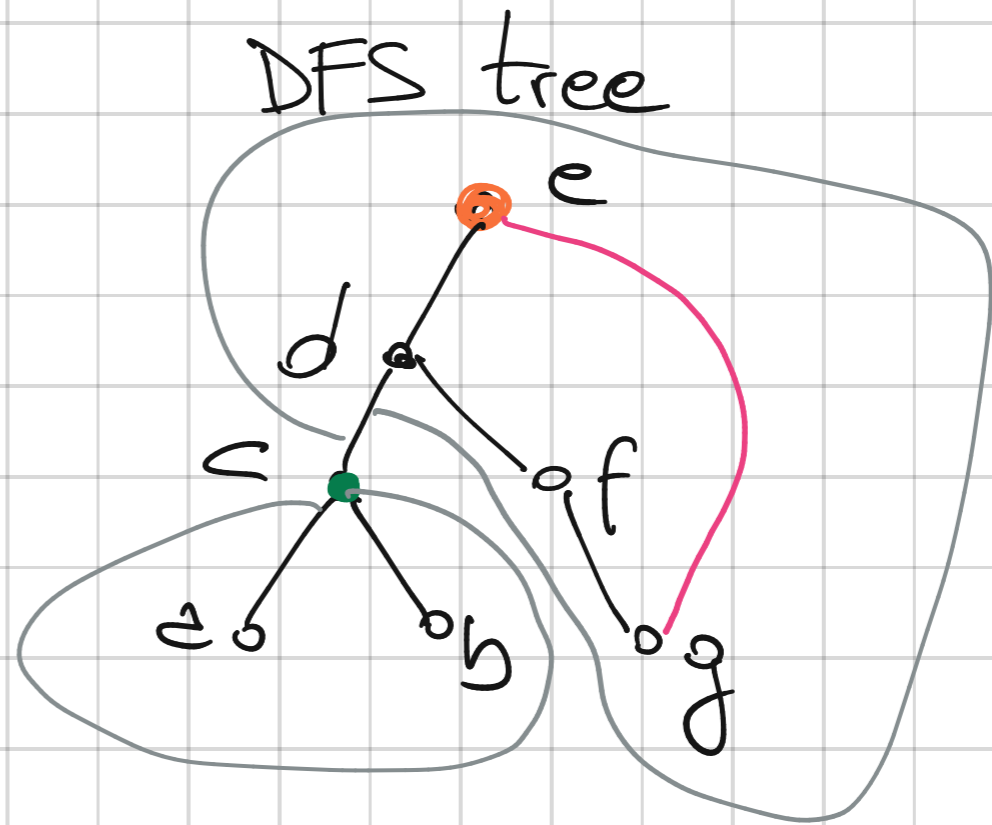
Question

Find all articulation vertices of a graph G ?

DFS depth-first visit



articulation vertex

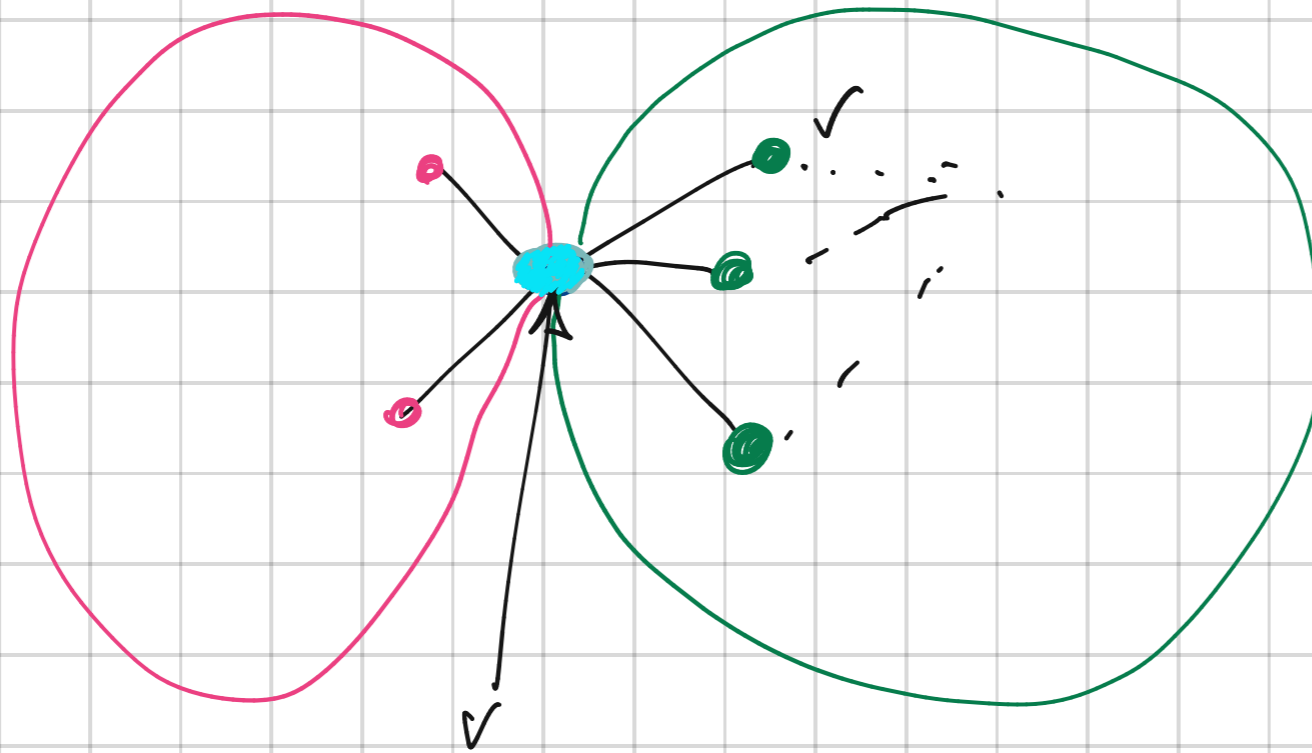


Compute biconnected components

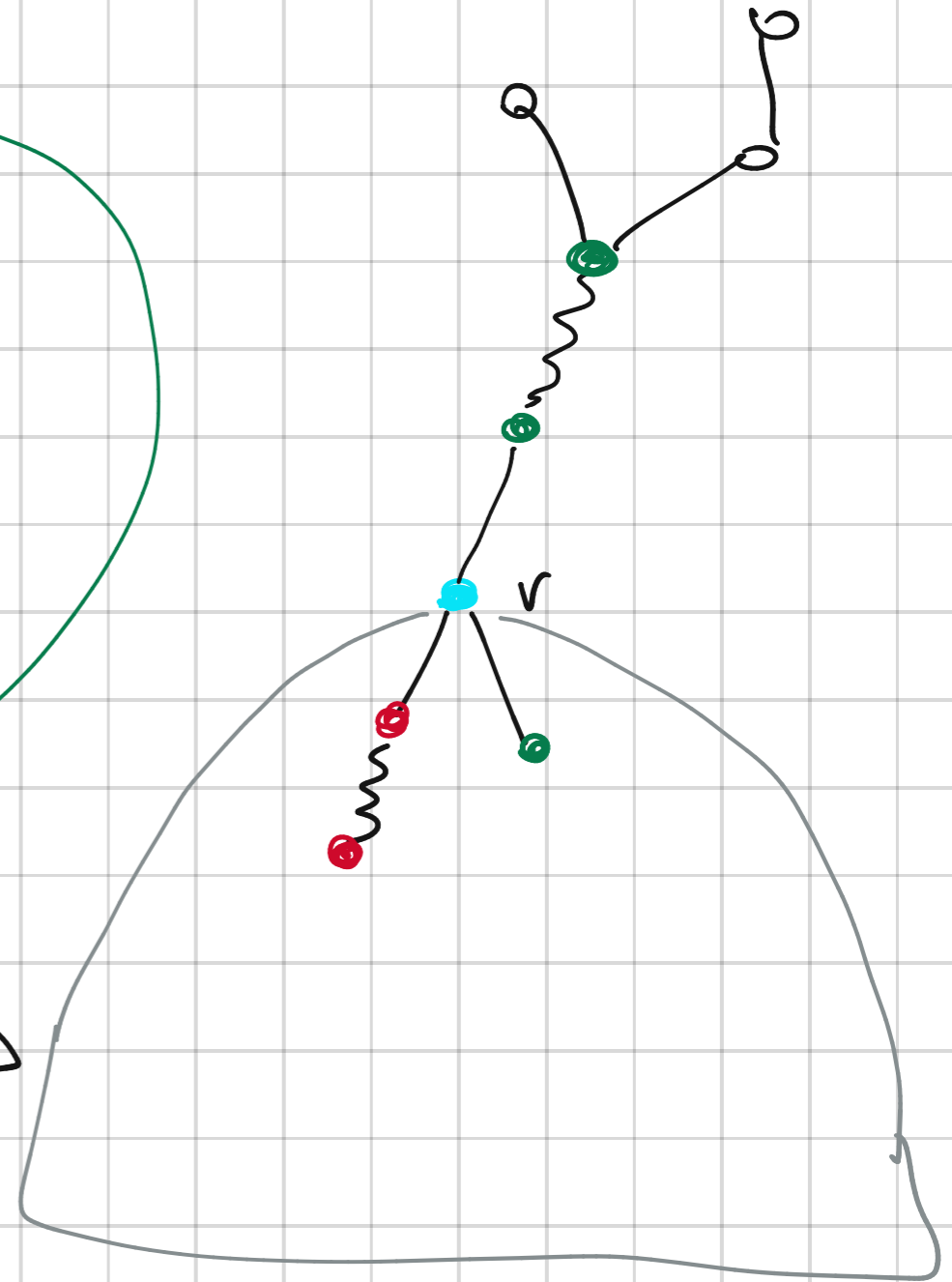
- $\text{lowpoint}(v)$: min depth of all neighbors of descendants of v

v is an articulation point iff $\text{lowpoint}(c) \geq \text{depth}(v)$
with c a child of v in DFS

root of DFS is a special case



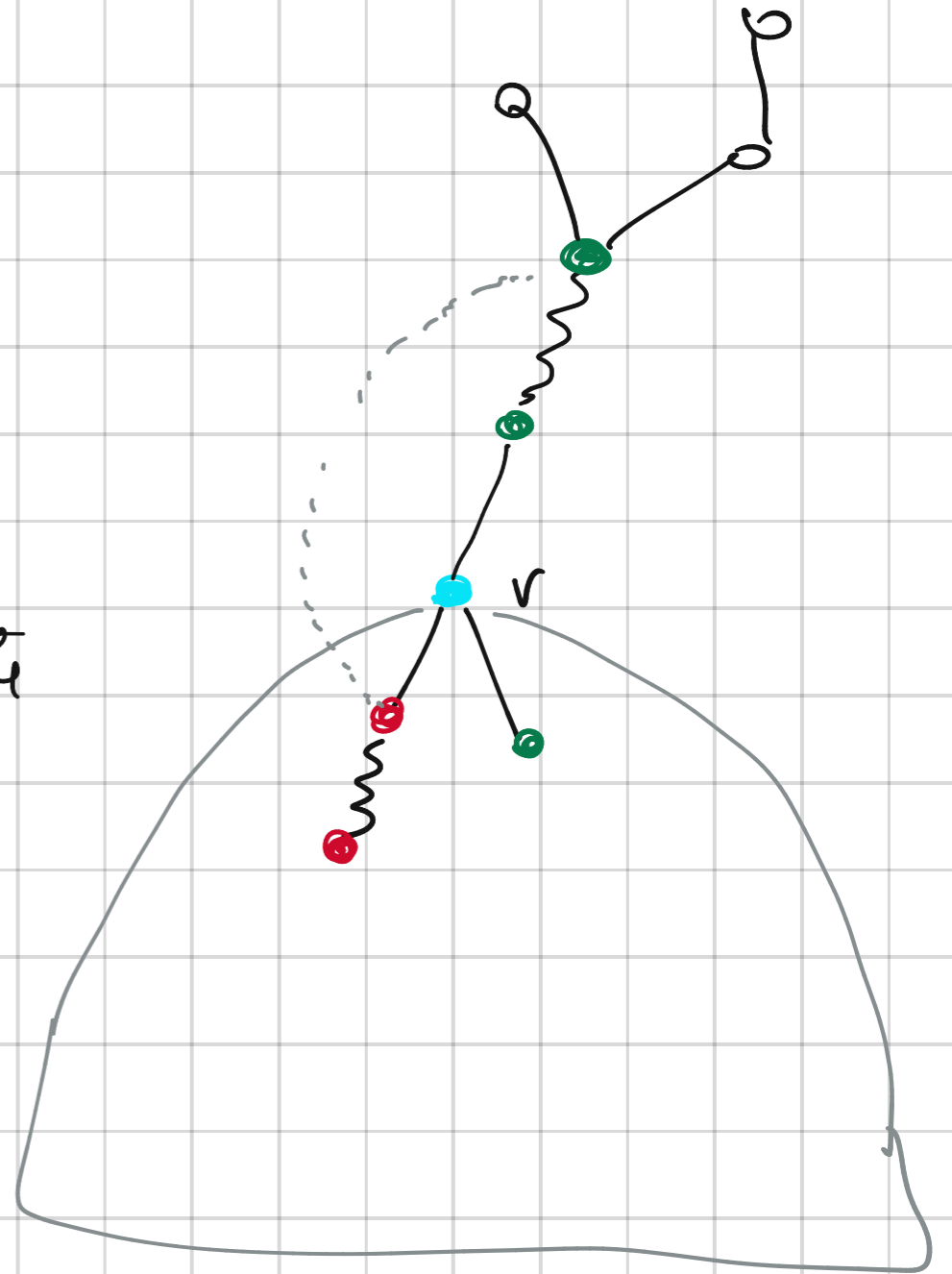
- 1) All red vertices are →
- 2) Red and green vertices are separated



Assume now v is not
an articulation point

Then there is a secure path
from \bullet to \bullet without going
through v .

Consider the last vertex of such path
that is below $v \Rightarrow$
it is adjacent to a vertex
above $v \Rightarrow$ depth of lowpoint
of \bullet is smaller than that of \bullet .



Topological Sort

$L :=$ empty list (contains the sorted vertices)

While there exists at least an unvisited source s

 Add s to the end of L

 Remove all arcs outgoing from s

Topological sort via DFS

$L :=$ empty list

While there is an unmarked vertex v

visit(v)

Visit(v)

if v is visited \Rightarrow Return

For each w s.t. (v, w) is an arc

visit(w)

Add v to the head of L

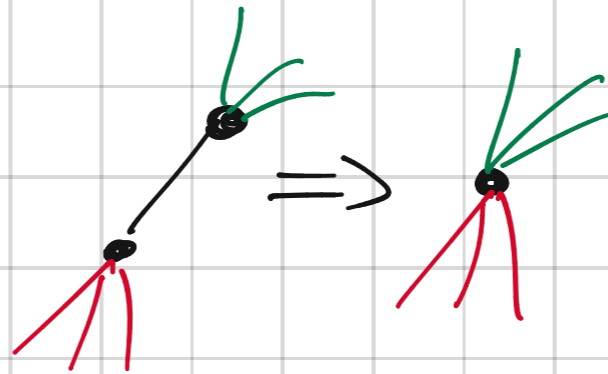
Graph classes

- Interval graphs
- Series-parallel graphs

Graph minor

H is a minor of G if H can be obtained from G via:

1. deleting vertices
2. deleting edges
3. contracting edges

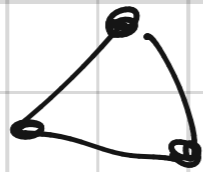


Robertson - Seymour Theorem

Let P be a property that is preserved by minor.

Then there exist a finite set F of forbidden minors such that a graph G has P iff no minor of G is in F .

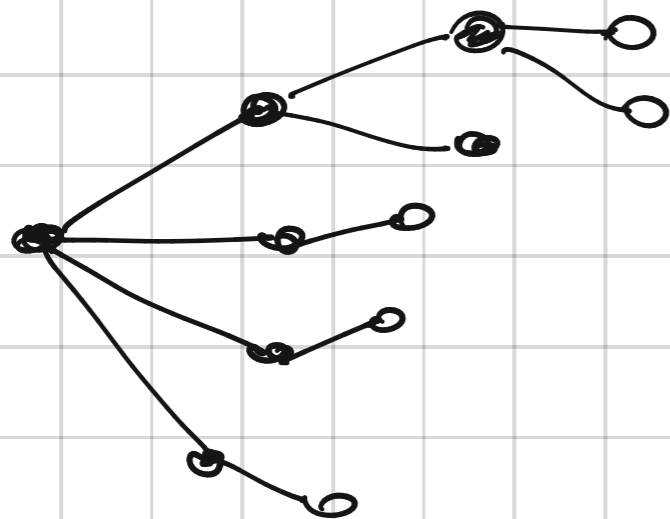
• Forests



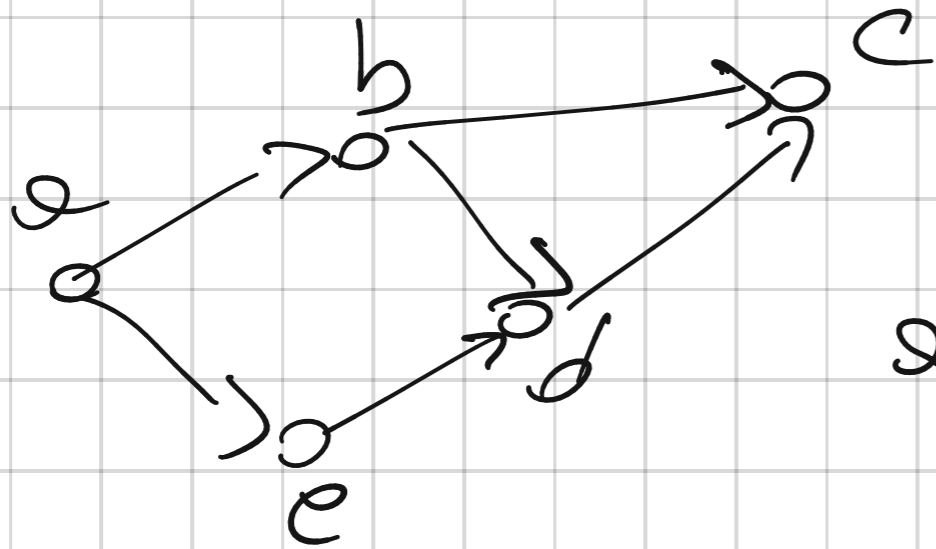
Given $F \Rightarrow$ Polynomial algorithm

BFS

breadth-first visit



- compute the connected components
- shortest path from v to w
- Topological sort (given a dag G -
dag = directed acyclic graph - find an
order of V consistent with the arcs of G)



a b e d c ← Topological Sort

$N^-(a) = \emptyset$ source

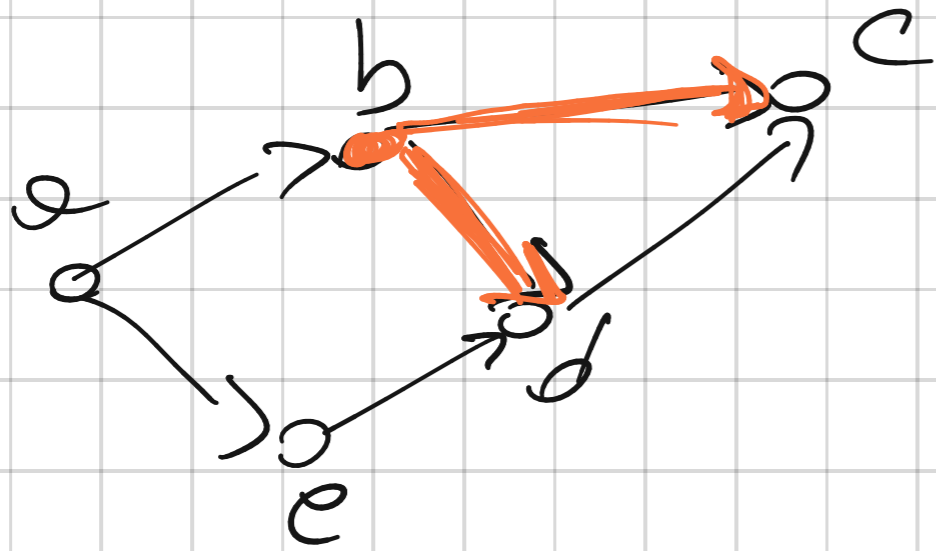
$N^+(c)$ sink

$L :=$ empty list

While there is a source s

Put s at the end of L

Remove all arcs outgoing from s



$A = \text{DFS}(v)$ A is the set of vertices reached from v with the $\text{DFS}(v)$ (excluded v)

$b \mid (c, d)$

$\text{DFS}(d)$

$\text{DFS}(e)$

$e \mid (c, d)$

$L := \text{empty list}$
While there is a vertex v that is not in L :
 Visit(v)

Visit(v)

if v is in $L \Rightarrow$ Return

For each w such that (v, w) is an edge

 Visit(w)
Add v to the head of L

BFS (v)

queue $Q := (v)$

All vertices in V are unmarked, except for v

While Q is not empty

Extract the first element x of Q

For each unmarked vertex w s.t. $(x, w) \in E$

Mark w

Add w to the end of Q

BFS(v)

- Maintaining a queue Q
- extract from Q a vertex x s.t.
there exists an edge (w, x) with w
output the earliest.

Lex-BFS(v)

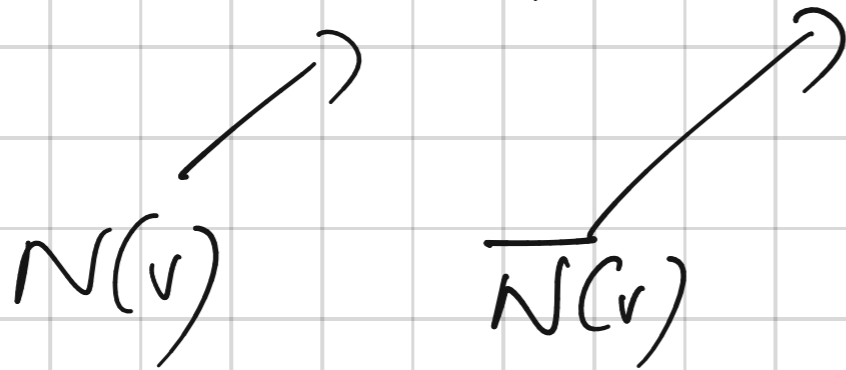
- extract from Q the vertex x whose set
of predecessors is lexicographically
smallest

$$S = (v_1, v_2, \dots, v_n)$$

1) Pick the first vertex v from the first set

Split each set X in S into $X \cap N(v)$, $X \setminus N(v)$

$$S = ((v_3, v_5, \dots) (v_2, v_4, \dots))$$



BFS maintain a list T of visited vertices

let $v, w \in V$ at a certain point in time

$$T \quad v \rightarrow N(v) \cap T$$

$$w \rightarrow N(w) \cap T$$

$$T = v(t_1) \quad v(t_2) \quad v(t_3) \dots \quad v(t_n)$$

$$v = \quad 1 \quad 0 \quad 1 \quad 1$$

$$w = \quad 1 \quad 1 \quad 0 \quad 0$$

$v(t_1) \in N(w)$

$v(t_3) \notin N(w)$

Graph classes

- connected graphs
- acyclic graph
- trees

Recognizing a graph class C

Instance :

a graph G

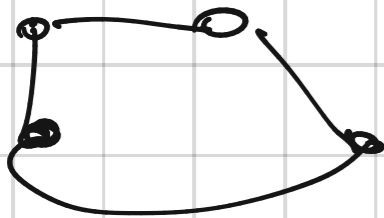
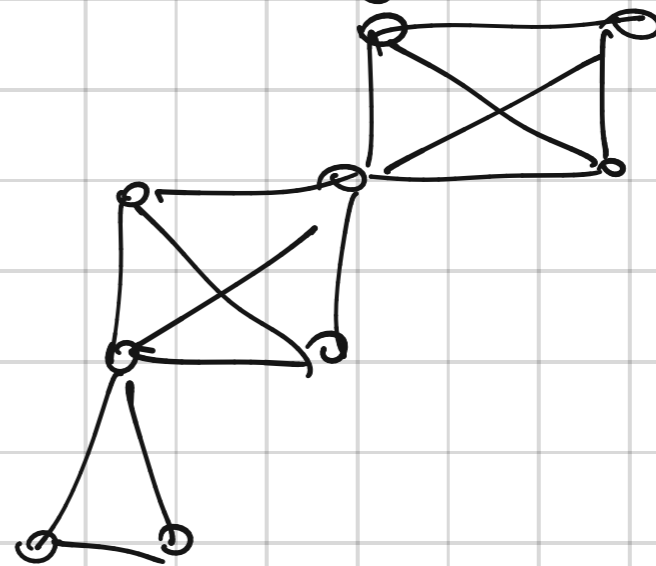
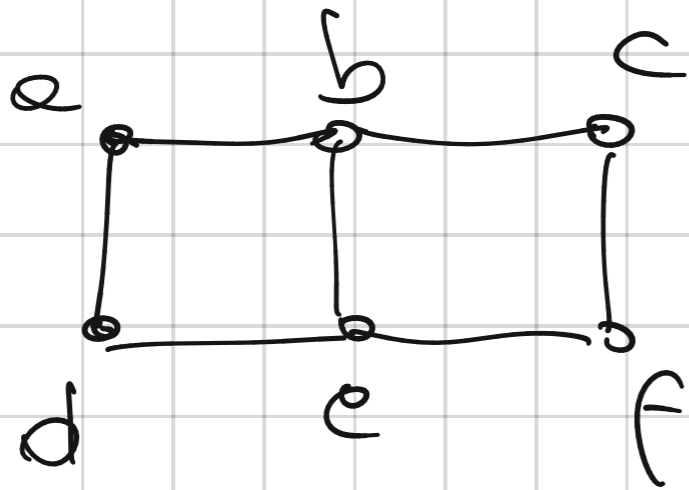
Question does G belong to the class C ?

Examples of graph classes

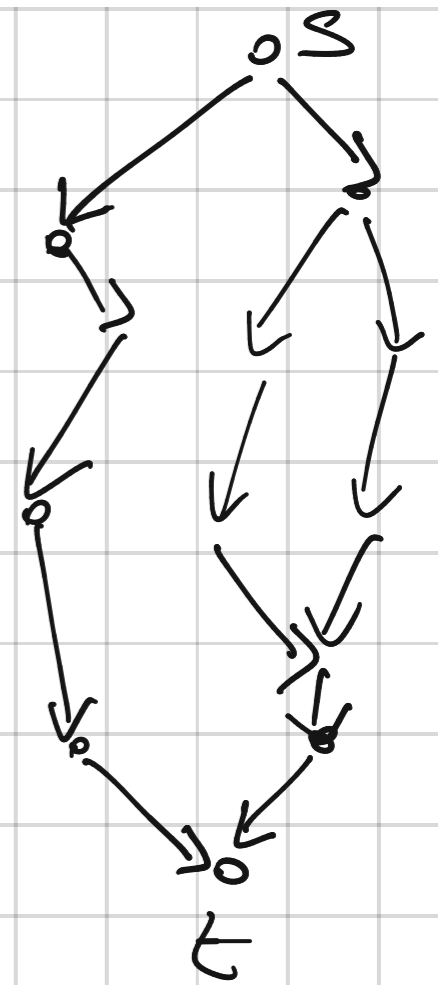
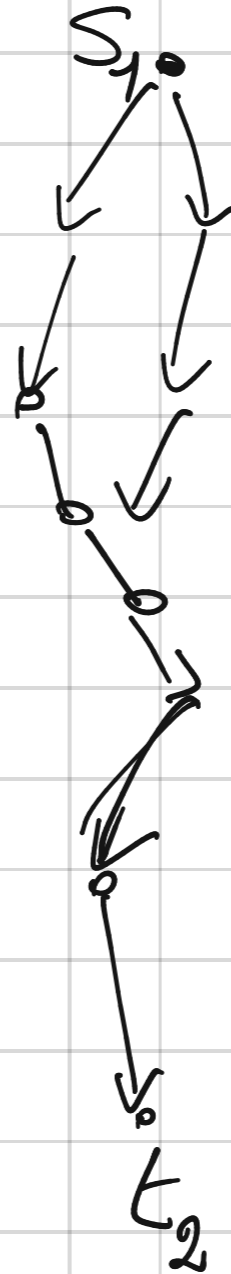
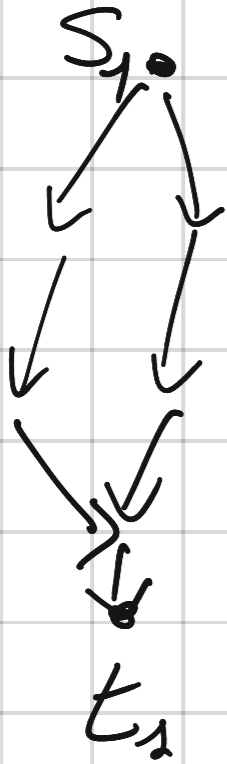
- Interval graphs

Vertices \rightarrow intervals on the line of reals

Edges \rightarrow overlapping intervals



• series-parallel graphs

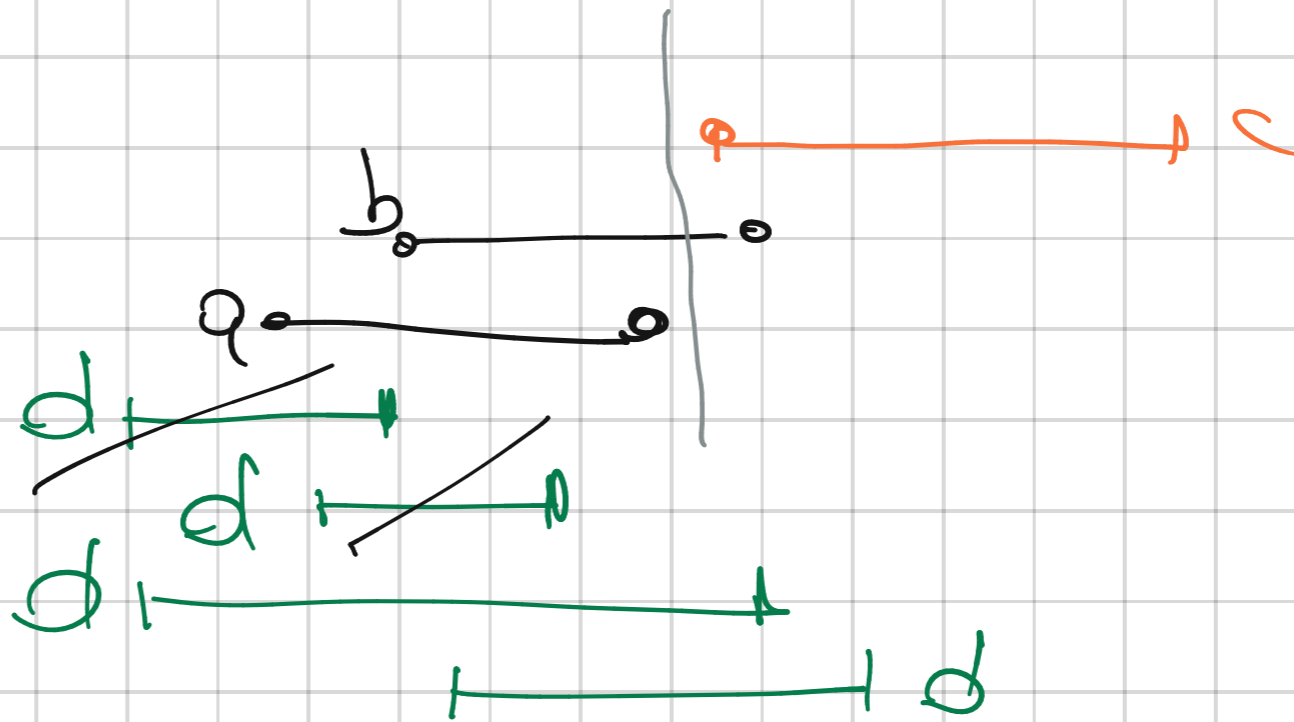
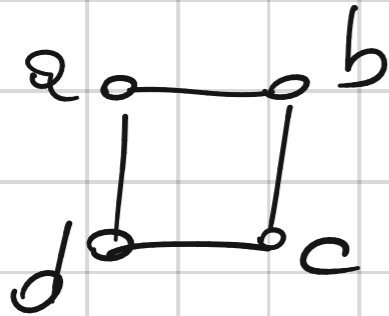


parallel

$s_1 \rightarrow t_1$

serie

Proof that C_4 is not an interval graph

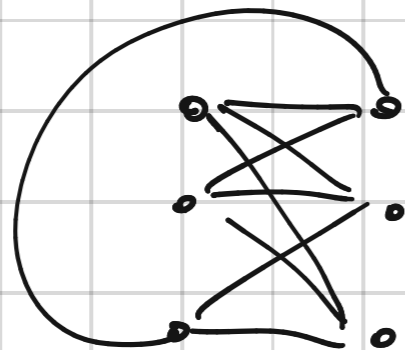
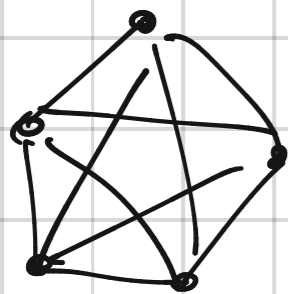


Planar graphs

G is a planar graph if it is possible to embed the vertices of G in the plane such that no two edges cross.

Wagner - Kuratowski theorem

G is planar iff it does not have
 K_5 or $K_{3,3}$ as minor



SPQR tree

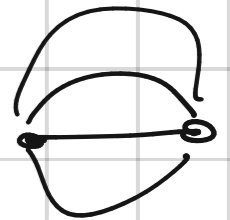
S: Series \Rightarrow a cycle with a virtual edge

P: parallel \Rightarrow a dipole

" "

" "

" "



Q: a single edge

R: rigid subgraph