

# Foundations of Computer Science

## Fundamentele Informatica 1

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Bachelor Informatica (& specialisaties)  
Universiteit Leiden

Najaar 2020



**Universiteit  
Leiden**

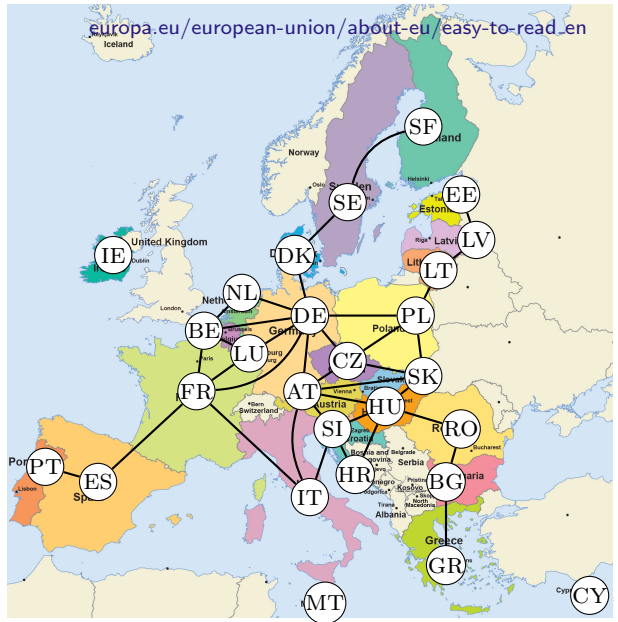
Leiden Institute of  
Advanced Computer Science

# Hoofdstuk 4

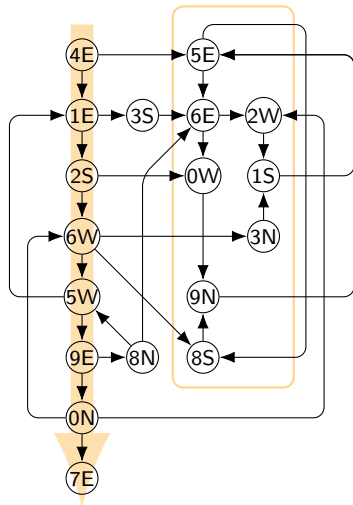
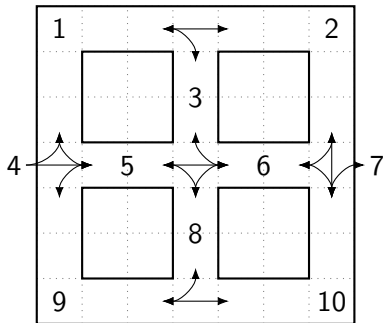
## Grafen

- 4 Grafen
  - Definities
  - Deelgraaf
  - Paden
  - Euler en Hamilton
  - Isomorfie
  - Speciale grafen
  - Vlakke grafen ☒
  - Gerichtte grafen

# European union

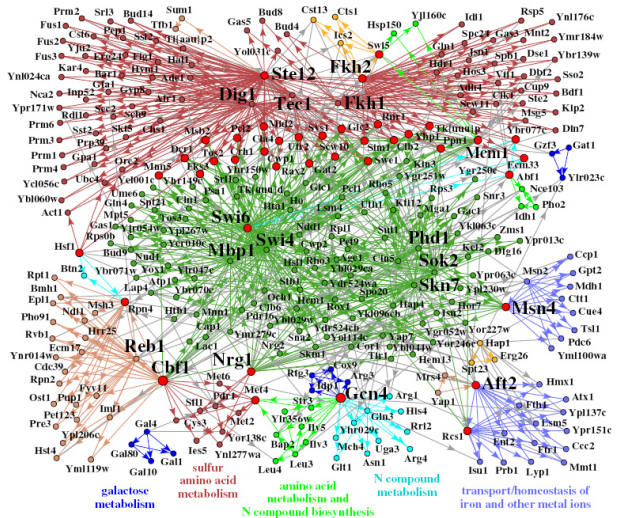


# farmer to the market



Robert Abbott multistate maze. [mathpuzzle.com](http://mathpuzzle.com)

# transcription regulatory interactions



Directed network modules, Palla et al. New Journal of Physics, 2007.

zie ook college [SNACS](#)



'families' grafen

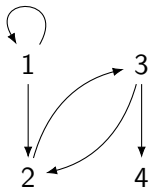
punten + verbindingen

- gericht vs ongericht
- parallele verbindingen **multi-**
- info verbindingen **gewogen**
- identiteit knopen **abstract**



wikipedia spoorlijnen



$\{ (1, 1), (1, 2), (2, 3), (3, 2), (3, 4) \}$ 

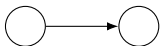
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2	0	0	1	0
3	0	1	0	1
4	0	0	0	0





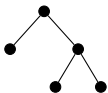
ONGERICHT

ch.8 Graph Theory



GERICHT

ch.9 Directed Graphs



ch.8.8 Tree graphs

ch.9.4 Rooted trees

ch.10 Binary Trees

## 4 Grafen

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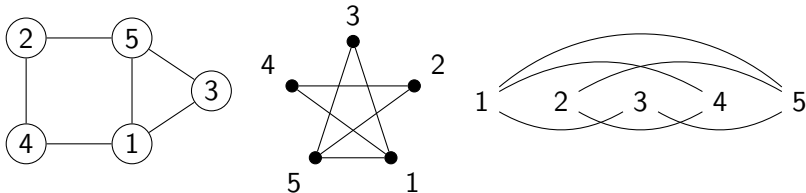


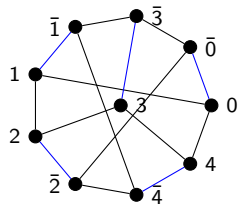
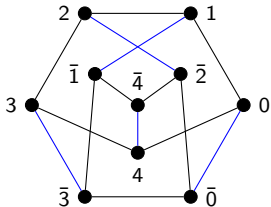
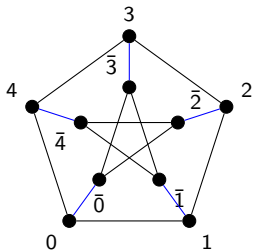
graaf  $G = (V, E)$  verzamelingen  $V, E$

- $V = V(G)$  knopen (punten; *vertices, nodes*)
- $E = E(G)$  lijnen (takken, zijden, kanten, bogen; *edges, arcs*)  
lijn  $\{u, v\}$  'pair distinct vertices'

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

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





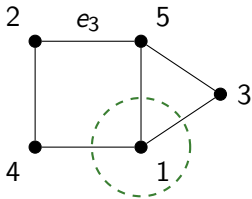
$G = (V, E)$   $e = \{u, v\}$  in  $E$

- $e$  *verbindt*  $u$  en  $v$
- $u$  *uiteinde* van  $e$
- $u$  en  $v$  *adjacent* (buren)
- $u$  en  $e$  *incident*

*graad* van  $v$     aantal buren

$\text{deg}(v)$

*geïsoleerd*     $\text{deg}(v) = 0$



$$G = (V, E)$$

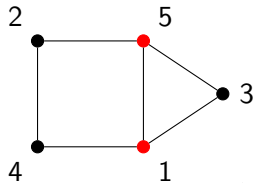
Thm. 8.1

som van de graden is twee keer aantal lijnen

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

gevolg

het aantal knopen met oneven graad is even



$G = (V, E)$  met  $V = \{v_1, v_2, \dots, v_n\}$  'geordend'

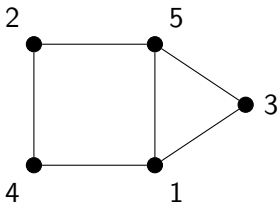
adjacency matrix    burenmatrix

$n \times n$  matrix     $A = (a_{ij})_{i,j=1\dots n}$

$$a_{ij} = \begin{cases} 1 & \{v_i, v_j\} \in E \\ 0 & \text{anders} \end{cases} .$$

ongerichte graaf:

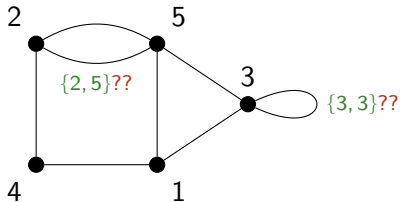
- symmetrisch
- nullen op diagonaal



		naar				
		1	2	3	4	5
van	1	0	0	1	1	1
	2	0	0	0	1	1
	3	1	0	0	0	1
	4	1	1	0	0	0
	5	1	1	1	0	0

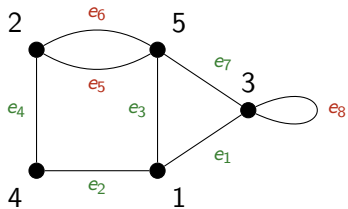
parallele lijnen

lus loop



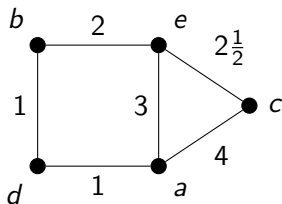
	1	2	3	4	5
1	0	0	1	1	1
2	0	0	0	1	2
3	1	0	1	0	1
4	1	1	0	0	0
5	1	2	1	0	0

incidentie matrix

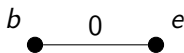


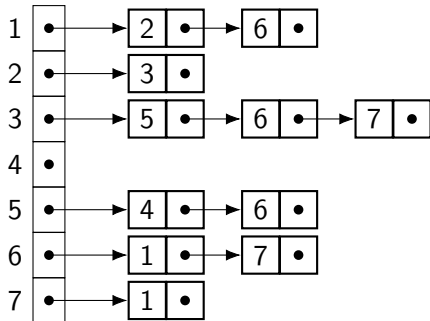
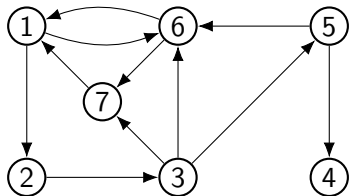
	e <sub>1</sub>	e <sub>2</sub>	e <sub>3</sub>	e <sub>4</sub>	e <sub>5</sub>	e <sub>6</sub>	e <sub>7</sub>	e <sub>8</sub>
1	1	1	1	0	0	0	0	0
2	0	0	0	1	1	1	0	0
3	1	0	0	0	0	0	1	1
4	0	1	0	1	0	0	0	0
5	0	0	1	0	1	1	1	0





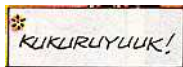
	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>
<i>a</i>	0	0	4	1	3
<i>b</i>	0	0	0	1	2
<i>c</i>	4	0	0	0	$2\frac{1}{2}$
<i>d</i>	1	1	0	0	0
<i>e</i>	3	2	$2\frac{1}{2}$	0	0





## 4 Grafen

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- Deelgraaf
- Paden
- Euler en Hamilton
- Isomorfie
- Speciale grafen
- Vlakke grafen ☒
- Gerichtte grafen



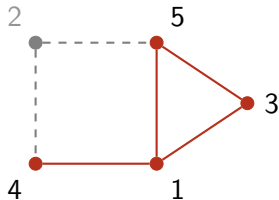
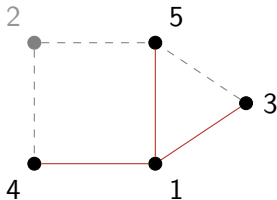
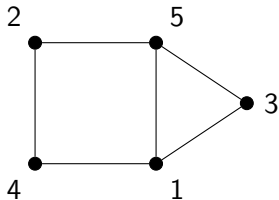
$$G = (V, E)$$

$$\text{subgraaf } G' = (V', E') \quad V' \subseteq V, E' \subseteq E$$

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

$$V' = \{1, 2, 3, 4, 5\}$$

$$E = \{13, 14, 15, 24, 25, 35\} \quad E' = \{13, 14, 15, 24, 25, 35\} \quad (\text{luie notatie})$$



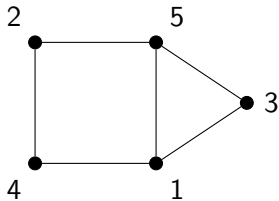
$$\text{geïnduceerde subgraaf } G' = (V', E')$$

$$V' = \{1, 2, 3, 4, 5\}$$

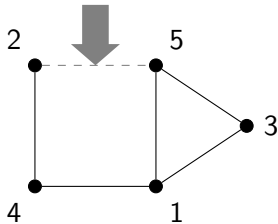
$$V' \subseteq V, E' = E \cap V' \times V'$$

$$E' = \{13, 14, 15, 24, 25, 35\}$$

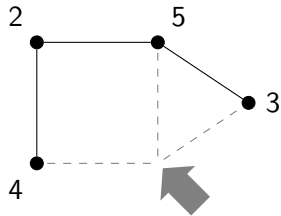
$G$



$G - e$

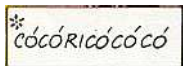


$G - u$



## 4 Grafen

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$v_0, e_1, v_1, e_2, v_2, e_3, \dots, e_n, v_n$      $e_k = \{v_{k-1}, v_k\}$

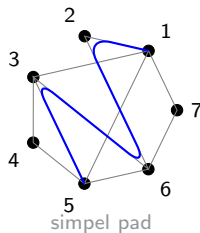
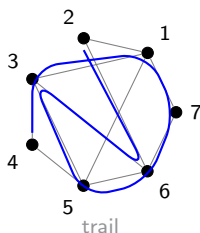
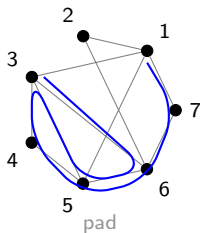
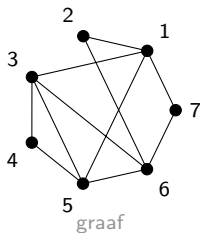
**pad**     $v_0, v_1, v_2, \dots, v_n$      $\{v_i, v_{i+1}\} \in E$     1, 7, 6, 5, 4, 3, 5, 6, 3

van  $v_0$  naar  $v_n$     tussen ...

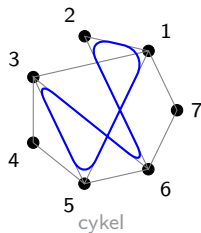
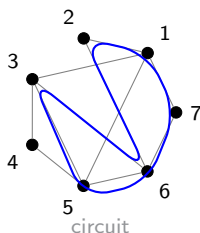
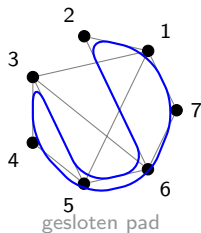
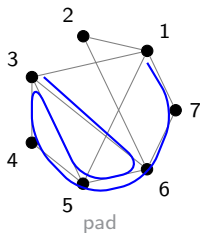
lengte  $n$

**trail**    verschillende *lijnen*    2, 6, 3, 5, 6, 7, 1, 3, 4

**simpel pad**    verschillende *knopen*    1, 2, 6, 3, 5



pad	$v_0, v_1, v_2, \dots, v_n$	$\{v_i, v_{i+1}\} \in E$	1, 7, 6, 5, 4, 3, 5, 6, 3
gesloten pad	$v_0 = v_n$	kring	1, 2, 6, 5, 3, 4, 5, 6, 7, 1
circuit		verschillende lijnen	1, 2, 6, 3, 5, 6, 7, 1
cykel		verschillende knopen	1, 2, 6, 3, 5, 1





distinct	edge		vertex	edge		vertex
Schaum	path	trail	simple path	closed (path)	$\times$ circuit	$\approx$ cycle
Wiki	walk	trail	path	closed (walk)	circuit	cycle

Schaum “cycle (or circuit)” (zie p.160).

“Hamilton circuit” “Euler circuit”

heeft een kring een beginpunt?

$n \geq 3$



$v, w, v$  géén cycle

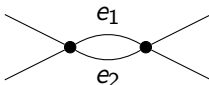
gewone (simpele) graaf

simpel  $\subseteq$  trail  $\subseteq$  pad

verschillende knopen  $\implies$  verschillende lijnen

multigraaf

$v_0, e_1, v_1, e_2, v_2, e_3, \dots, e_n, v_n$   $e_k$  tussen  $v_{k-1}$  en  $v_k$



graaf  $G$   $x, y \in V(G)$

Thm. 8.2.

Als er een pad is van  $x$  naar  $y$  in  $G$ , dan is er ook een *simpel* pad van  $x$  naar  $y$ .



$$x = x_0, x_1, \dots, x_{i-1}, \boxed{x_i}, \overbrace{x_{i+1}, \dots, x_{j-1}}, \boxed{x_j}, x_{j+1}, \dots, x_n = y$$

$$x = x_0, x_1, \dots, x_{i-1}, \boxed{x_i = x_j}, x_{j+1}, \dots, x_n = y$$

(herhalen)

verbonden  $x \sim y$  pad tussen  $x$  en  $y$

equivalentierelatie

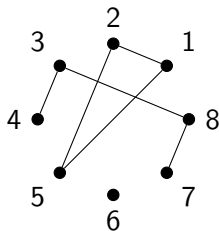
–  $x \sim x$  reflexief pad van lengte nul

– als  $x \sim y$  dan  $y \sim x$  symmetrisch

pad omdraaien

– als  $x \sim y$  en  $y \sim z$  dan  $x \sim z$  transitief

paden achter elkaar



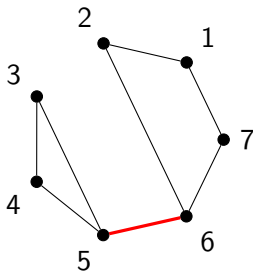
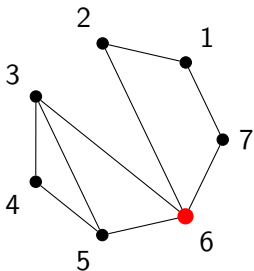
$\{1, 2, 5\}$ ,  $\{3, 4, 7, 8\}$ ,  $\{6\}$

(samenhangs-)component

aantal componenten neemt bij verwijderen toe

$G - v$  *articulatie punt*  $v$  (cutpoint)

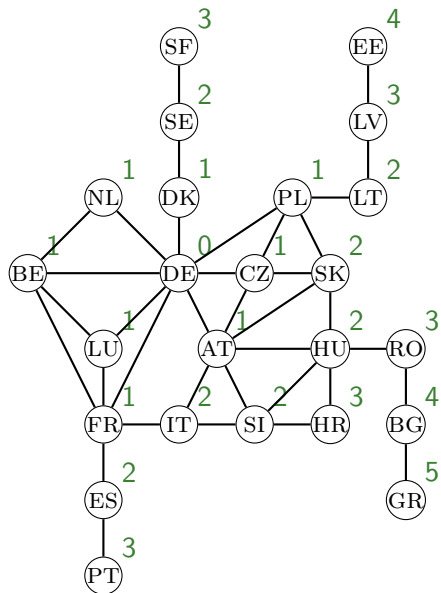
$G - e$  *brug*  $e$  (cut edge)



$d(x, y)$  afstand lengte kortste pad (gemeten in lijnen)

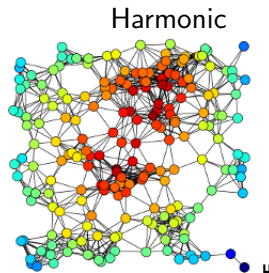
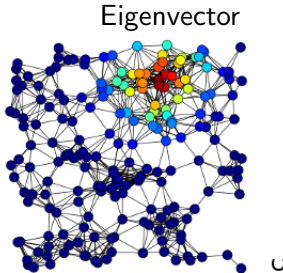
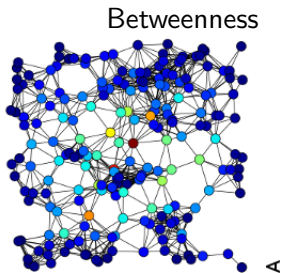
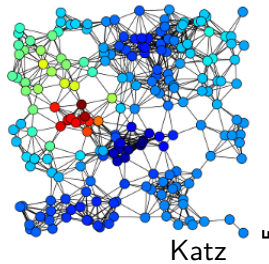
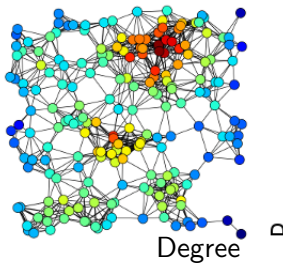
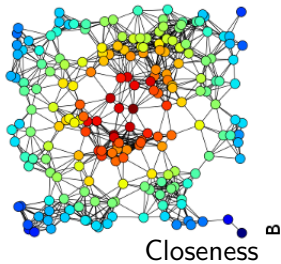
- $d(x, y) = 0$  desdals  $x = y$
- $d(x, y) = d(y, x)$
- $d(x, z) \leq d(x, y) + d(y, z)$  *driehoeksongelijkheid*

diameter  $G$  langste afstand



$$d(\text{GR}, \text{EE}) \leq d(\text{GR}, \text{DE}) + d(\text{DE}, \text{EE}) = 9$$

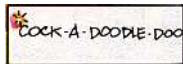
wikipedia: Centrality



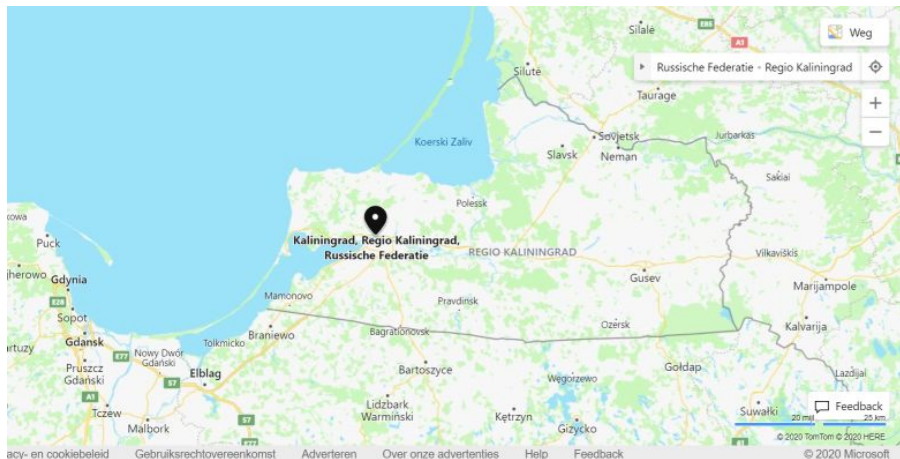


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## Kaliningrad / Königsberg in Preußen

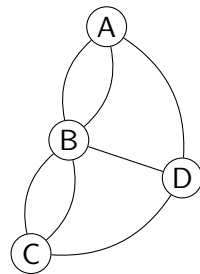
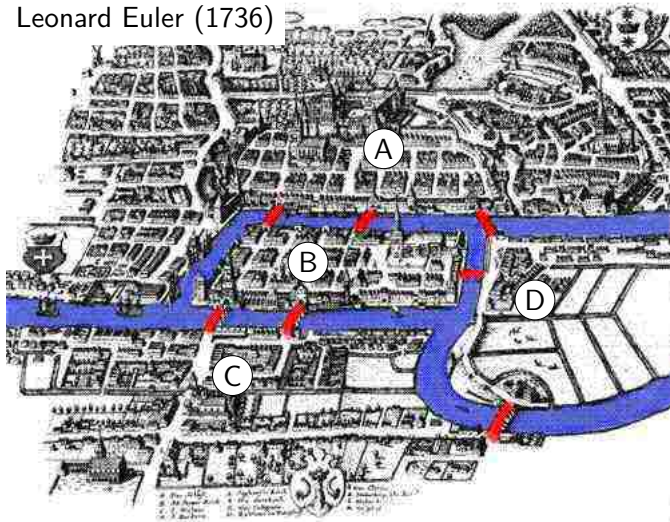


bing maps



# Koningsberger bruggen probleem

Leonard Euler (1736)



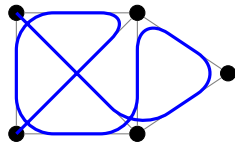
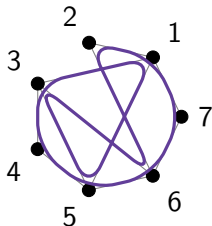
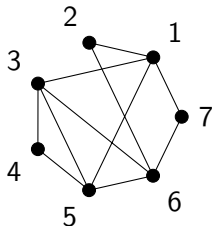
Leonhard Euler. Solutio problematis ad geometriam situs pertinentis

**Euler circuit** alle lijnen precies één keer

**Euler graph** heeft Euler circuit

Thm. 8.3

samenhangende graaf  $G$  is Euler desda elke knoop heeft even graad

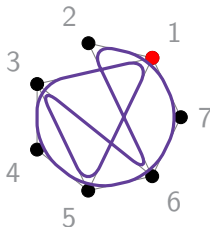
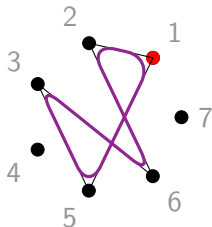
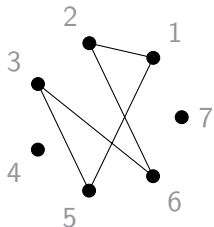
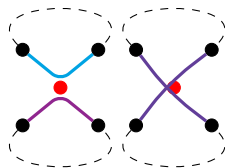
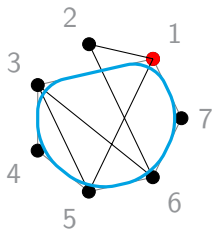
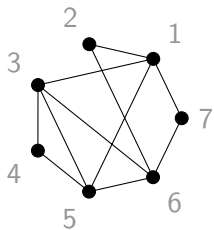


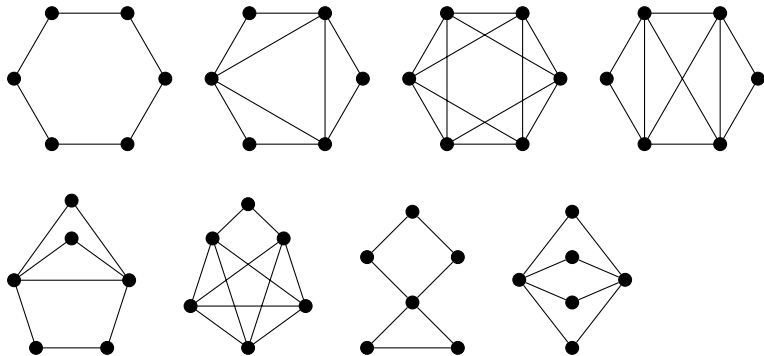
Cor. 8.4

**Euler trail** maximaal twee oneven graad

Euler circuit alle lijnen precies één keer

samenhangende graaf  $G$  is Euler desda elke knoop heeft even graad





☒ 'Sloane' [A003049](#) online encyclopedia of integer sequences

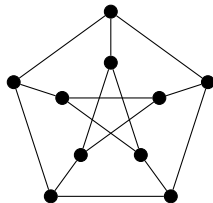
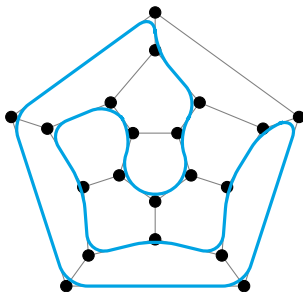


William Rowan Hamilton 1857



Hamilton cykel alle knopen precies één keer

Hamilton graph heeft Hamilton cykel




### ☒ Ore's Theorem (1960)

A simple graph with  $n$  vertices ( $n \geq 3$ ) is Hamiltonian if, for every pair of non-adjacent vertices, the sum of their degrees is  $n$  or greater.

$$(u, v) \notin E \text{ dan } \deg(u) + \deg(v) \geq n$$



V	R	N
A		I
E	T	K

wikipedia


	gen	die	ren	mernd	fehn	a-	al-	spin-	
stun-	ih-	flim-	tra-	stern	häup-	nen	man-	dem	daß
ein	nacht	nen	stnft	dun-	di-	zu	nacht	te	tel
die	den	die	hält	ter	kein	gen	von	geht	ter-
	ter-	die	rin-	eß	en-	nun	jahr	eß	
	zeit	wacht	de	heu-	stol-	eiß	gen	mit-	
wein-	den	son-	ei-	e	doch	nur	laut	in	zwölf-
nen-	die	der	te	grün	den-	re	mal	ra-	dröhnt
durch	stur-	wald	wip-	ih-	treu-	lings-	wald	die	lich-
vom	wen-	weg'n	me	hen	hüllt	weiß	nen	me	und
im	und	na-	de	fel	früh-	tur-	feld	teß	tan-

Die Gartenlaube (1899) [wikipedia](#)

Hamilton cykel alle knopen precies één keer

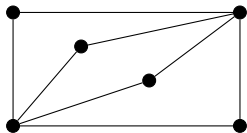
Hamilton graaf heeft Hamilton cykel

### Stelling

 NP-compleet om te bepalen of  $G$  Hamilton is

## Euler

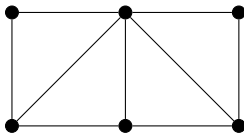
alle lijnen



eenvoudige karakterisatie

## Hamilton

alle knopen



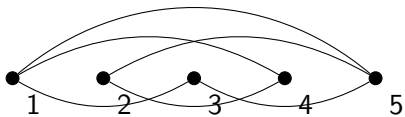
geen karakterisatie

*computationally hard*

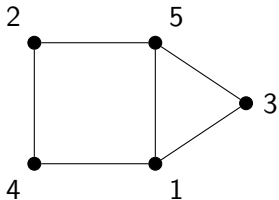
## 4 Grafen

- Definities
- Deelgraaf
- Paden
- Euler en Hamilton
- **Isomorfie**
- Speciale grafen
- Vlakke grafen ☒
- Gerichtte grafen

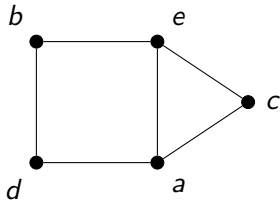




$G$

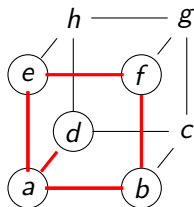
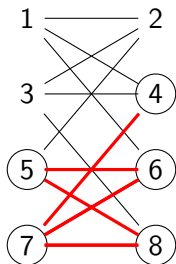


$G'$



$u$	1	2	3	4	5	6	7	8
$\varphi(u)$	$h$	$g$	$c$	$d$	$f$	$e$	$a$	$b$

behoudt aantal knopen, aantal lijnen, graden, paden, ...

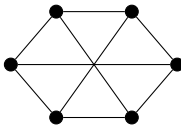
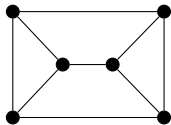
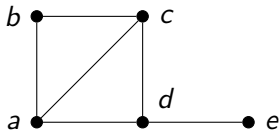
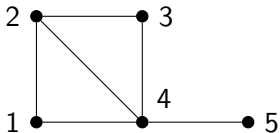


$$G = (V, E) \quad G' = (V', E')$$

isomorfisme  $\varphi : V \rightarrow V'$  bijectie

$(u, v) \in E$  desda  $(\varphi(u), \varphi(v)) \in E'$

behoudt aantal knopen, aantal lijnen, graden, paden, ...



'abstracte' grafen

Unsolved problem in computer science

Can the graph isomorphism problem be solved in polynomial time?

P vs. NP

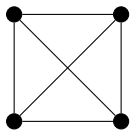
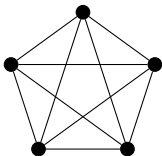
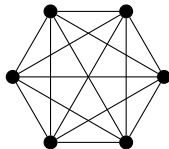


## 4 Grafen

- Definities
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- Euler en Hamilton
- Isomorfie
- **Speciale grafen**
- Vlakke grafen ☒
- Gerichtte grafen

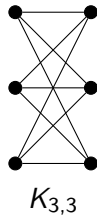
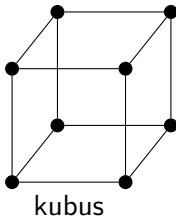
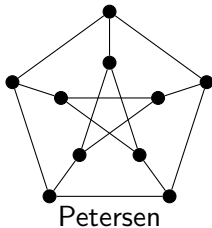
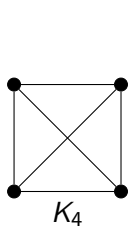


$K_n$  complete graaf

 $K_4$  $K_5$  $K_6$ 

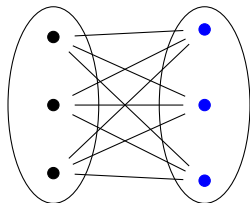
$$|V| = n \quad |E| = \frac{n(n-1)}{2}$$

*k*-regulier alle knopen graad *k*



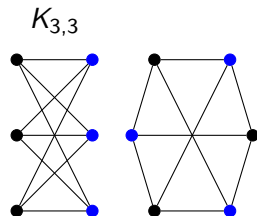
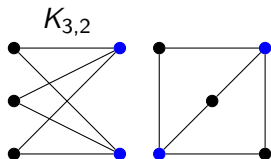
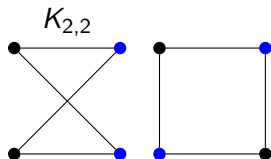
$$|V| = n \quad |E| = \frac{k}{2}n$$

$K_{m,n}$  compleet bipartiet



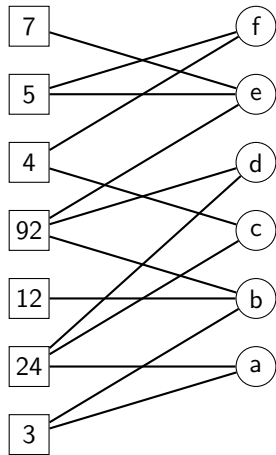
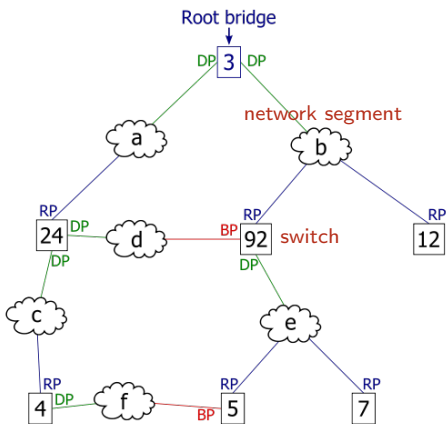
$$|V| = m + n$$

$$|E| = m \cdot n$$



## bipartiete graaf

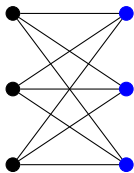
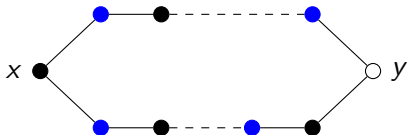
lijnen alleen tussen twee (disjuncte) deelverzamelingen knopen



Thm. 8.11.

graaf  $G$ , equivalent zijn:

- ①  $G$  is bipartiet
- ②  $G$  heeft alleen cykels van even lengte
- ③  $G$  is 2-kleurbaar

 $(1, 3) \implies (2)$  $(2) \implies (1, 3)$ 

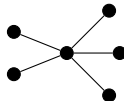
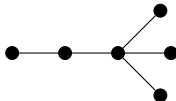
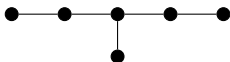
(1)  $\implies$  (2) Als de graaf bipartiet is loopt elk pad van een knoop naar zichzelf steeds heen en weer tussen de partities. Om terug te komen dus een even aantal stappen.

(2)  $\implies$  (1) Omgekeerd nemen we aan dat de graaf alleen kringen van even lengte heeft. We gaan de knopen uit de graaf zwart-blauw kleuren om zo de twee partities te onderscheiden. Kies een willekeurige knoop  $x$  van de graaf en kleur deze zwart. Als een knoop gekleurd is dan krijgen zijn burens de tegengestelde kleur. Dat leidt niet tot problemen: er is geen (ongekleurde) knoop  $y$  met zowel een zwarte als een blauwe buur. Dan zou namelijk  $y$  vanuit  $x$  te bereiken zijn met zowel een oneven als een even aantal lijnen, en vinden we een kring van oneven lengte.



## boom

- samenhangend
- acyclisch    geen cykels



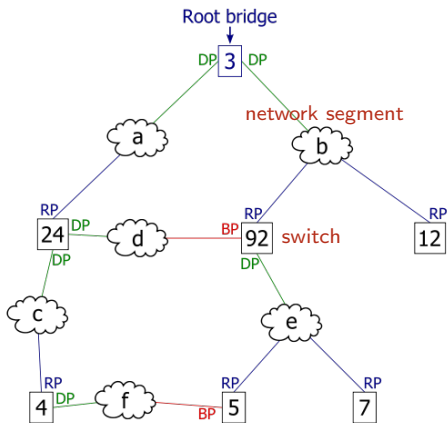
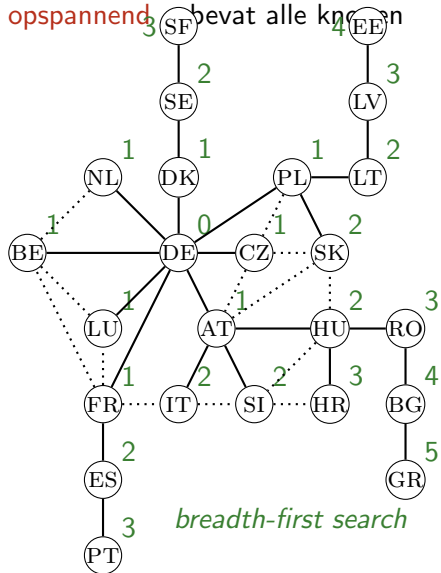
eigenschappen:

- ▶ tussen elk tweetal knopen precies één simpel pad
- ▶  $|E| = |V| - 1$

Sch 8.8 Tree graphs    Sch 10 Binary trees    (apart)

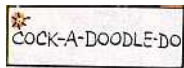


opspannend bevat alle knopen

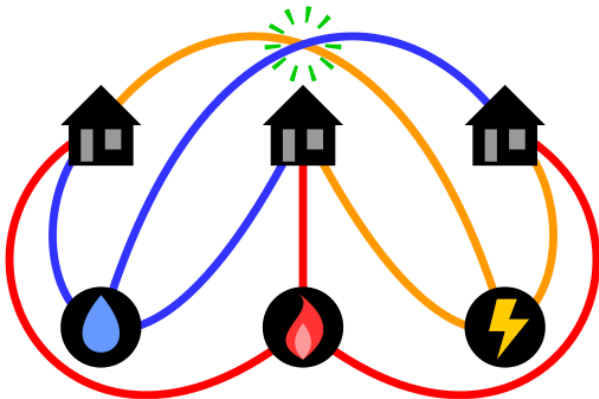


## 4 Grafen

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- Isomorfie
- Speciale grafen
- Vlakke grafen ☒
- Gerichtte grafen

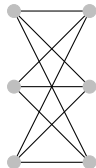
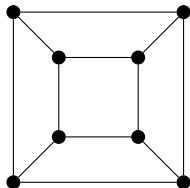
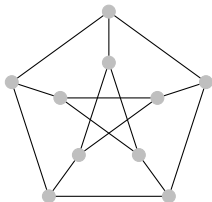
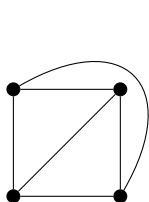
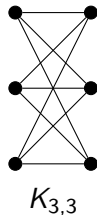
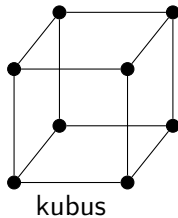
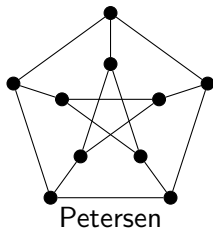
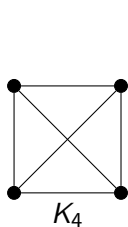


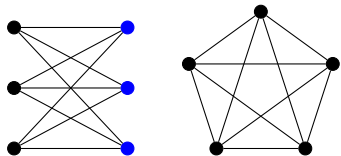
vlakke graaf



Cmglee [wikipedia](#)

*vlakke* graaf zonder kruisende lijnen

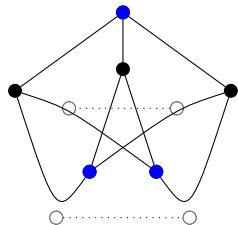




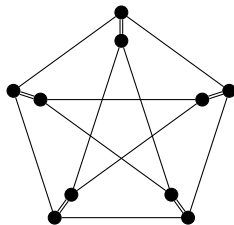
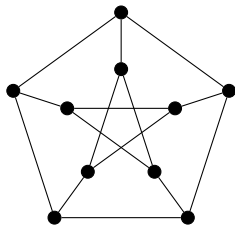
☒ Thm. 8.10

Een graaf  $G$  is vlak desdals  $G$  niet  $K_{3,3}$  of  $K_5$  bevat

*Kuratowski* (1930)



*Wagner* (1937)



$G = (V, E)$  planaire graaf vlakken  $R$  (*regions*)

☒ Thm. 8.8. Euler

$$|V| - |E| + |R| = 2$$

$$|V| = 20, |E| = 30, \\ |R| = 12$$

$$|V| = 8, |E| = 12, \\ |R| = 6$$

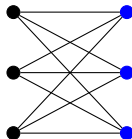
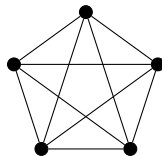
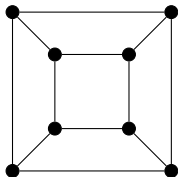
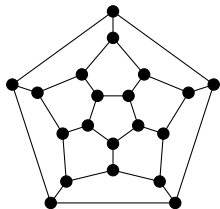
$$|V| = 5, |E| = 10 \\ |R| = 7?$$

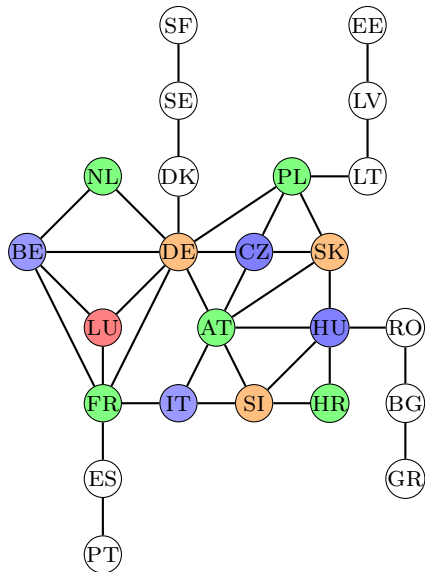
$$|V| = 6, |E| = 9 \\ |R| = 5?$$

**Thm.8.7.**  $5|R| = 2|E|$   $4|R| = 2|E|$

$$3|R| \leq 2|E|$$

$$4|R| \leq 2|E|$$





elke vlakke graaf heeft een 4-kleuring

Kempe 1879

Heawood 1890

☒ **Thm.8.12** vijfkleurenstelling

Appel & Haken 1974

handwerk + computerbewijs  
1,834 configurations

## 4 Grafen

- Definities
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gerichte graaf  $G = (V, E)$  verzamelingen

- $V = V(G)$  knopen (punten; *vertices, nodes*)
- $E = E(G)$  pijlen (takken, kanten; *edges, arcs*)  
pijl  $(u, v)$  geordend tweetal

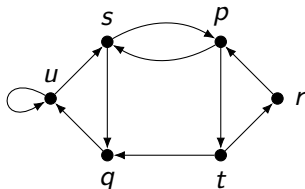
–  $e$  van  $u$  naar  $v$

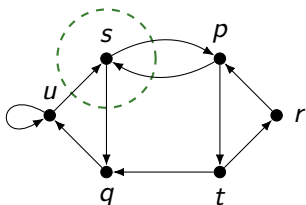
–  $u, v$  begin, eind van  $e$

–  $e = (u, u)$  lus loop

$V = \{ p, q, r, s, t, u \}$

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





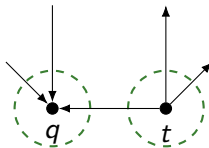
		naar					
		p	q	r	s	t	u
van	p	0	0	0	1	1	0
	q	0	0	0	0	0	1
	r	1	0	0	0	0	0
	s	1	1	0	0	0	0
	t	0	1	1	0	0	0
	u	0	0	0	1	0	1

in/uit-graad van  $v$

$indeg(v)$      $outdeg(v)$

**bron**     $indeg(v) = 0$     **source**

**put**     $outdeg(v) = 0$     **sink**

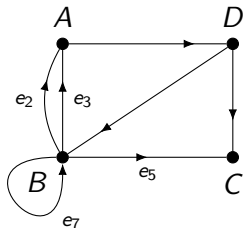


Thm. 9.1

$$\sum_{x \in V} indeg(x) = \sum_{x \in V} outdeg(x) = |E|$$

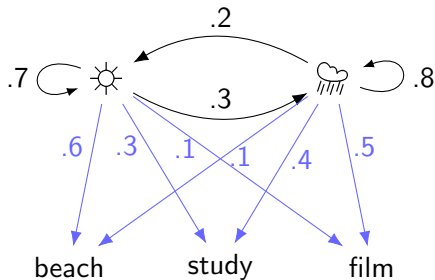
$\{\dots, (B, A), (B, A), \dots\}$ 

(gerichte) multigraaf



graaf met gewichten

☒ Hidden Markov Model



$v_0, e_1, v_1, e_2, v_2, e_3, \dots, e_n, v_n$

pad  $v_0, v_1, v_2, \dots, v_n \quad (v_i, v_{i+1}) \in E$

van  $v_0$  naar  $v_n$

lengte  $n$  aantal pijlen

- trail verschillende *lijnen*
- simpel pad verschillende *knopen*
- gesloten pad  $v_0 = v_n$  kring
- circuit verschillende lijnen
- cykel verschillende knopen
- opspannend pad bevat alle knopen



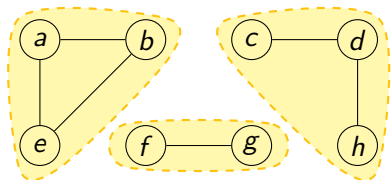
graaf **sterk samenhangend** voor elke  $x$  en  $y$  is er een pad van  $x$  naar  $y$

ongericht

pad tussen  $x$  en  $y$

*connected component*

samenhangs-component



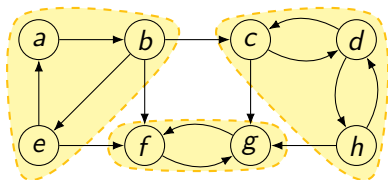
gericht

pad van  $x$  naar  $y$

én pad van  $y$  naar  $x$

*strongly connected component*

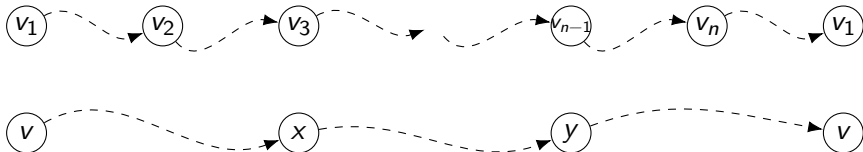
**sterke samenhangs-component**



## Thm. 9.2

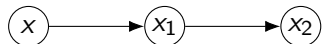
gerichte graaf  $G$ 

sterk samenhangend    desda    heeft een gesloten opspannend pad

ongerichte graaf  $G$ 

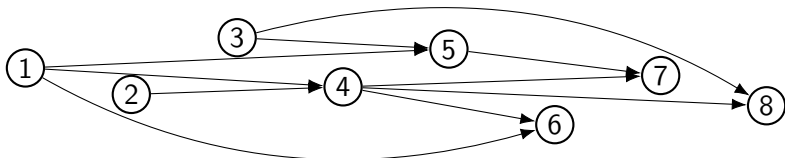
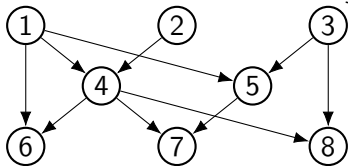
samenhangend    desda    heeft een opspannend pad

## Thm. 9.2

gerichte graaf  $G$ zonder cykels dan heeft  $G$  een put en een bron

$G = (V, E)$  gericht

*topologische ordening* van  $G$   $(v_1, \dots, v_n)$   $(v_i, v_j) \in E$  dan  $i < j$



$(1, 2, \dots, 7, 8)$   $(2, 1, 4, 6, 3, 5, 8, 7)$

Thm. 9.8

gerichte graaf  $G$  zonder cyclen dan bestaat er een topologische ordening



