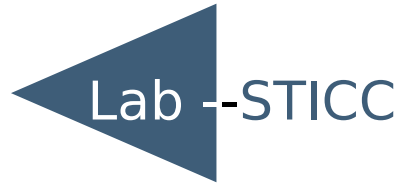


Graphs



Laurent.lemarchand@univ-brest.fr
http://www.labsticc.univ-brest.fr/pages_perso/lemarch/Cours

Relationships

- Relation between 2 entities
 - *Smaller than*
 - *Done before*
 - *Done by*
 -

Symmetrical
Relations
or not

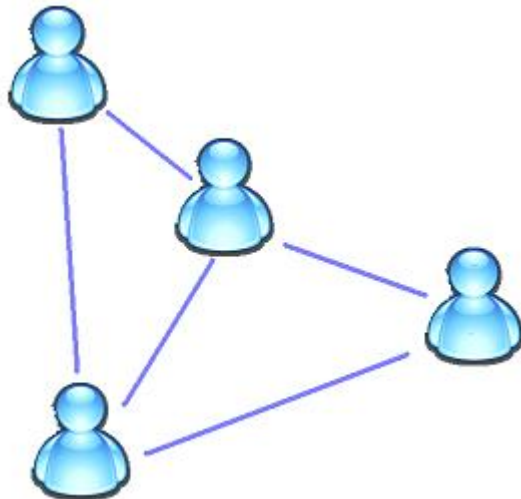
- Drawing :



Graph !

Symetric relations

- Relation between 2 entities
 - Know each other
- More global :
social network

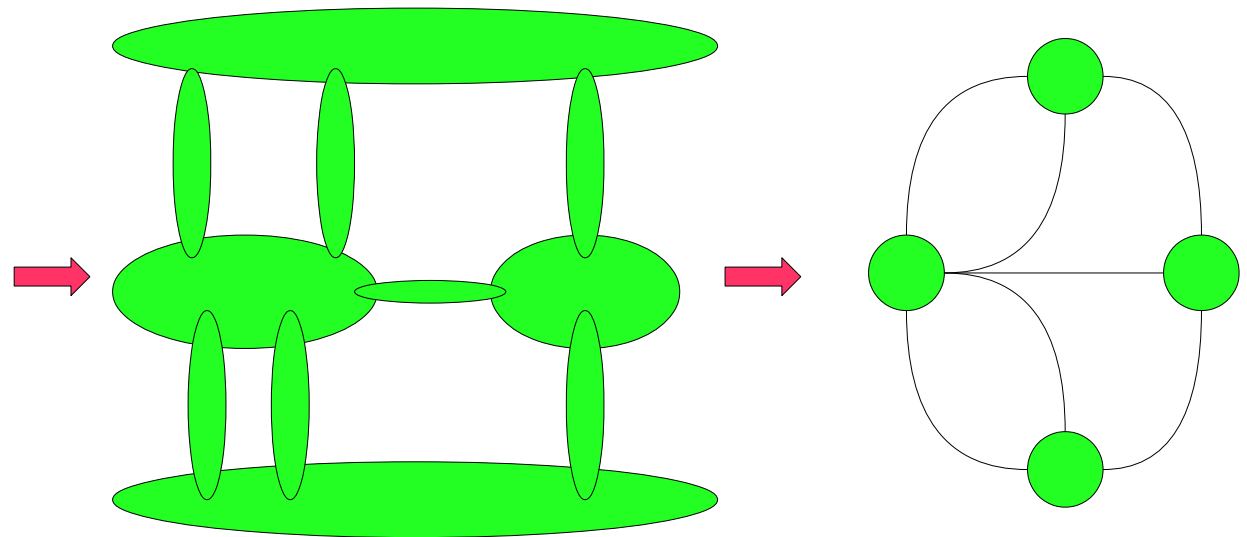
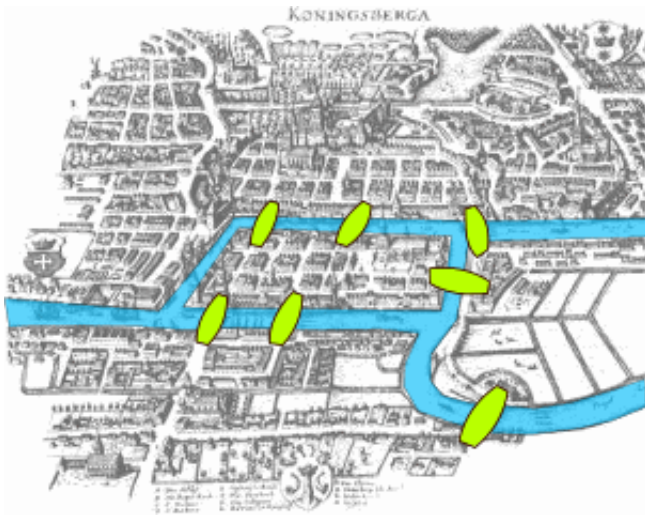


Average degree
=
Dunbar's number
=
125

History (1)

Konigsberg' bridges (Euler, 1736)

- 2 islands within the town, connected by a bridge, and also connected to the ground.
- Traverse all bridges once, with a round trip

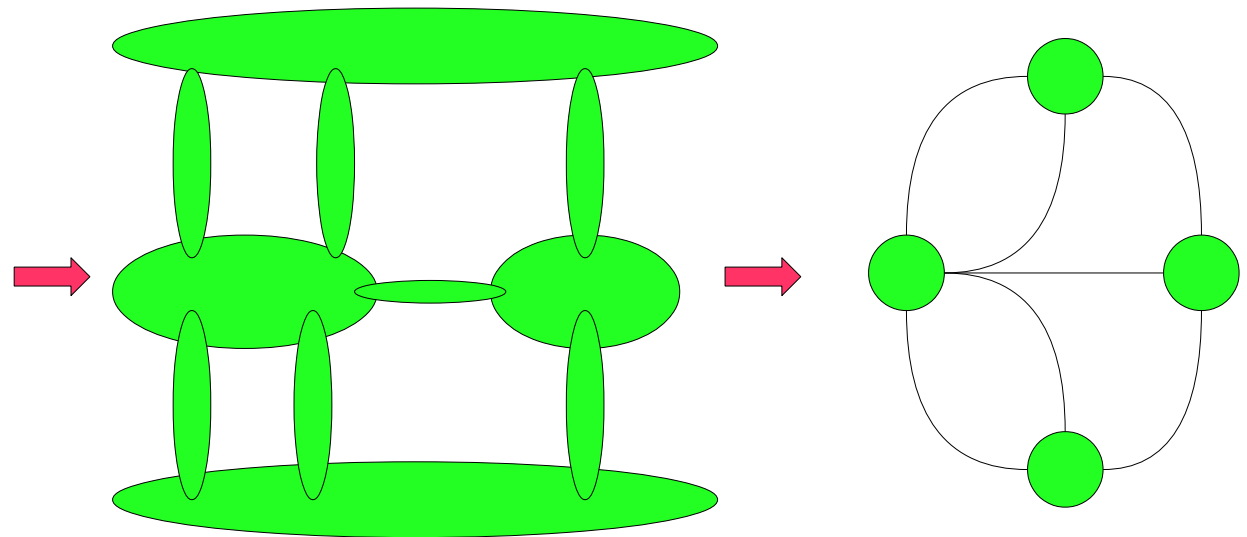
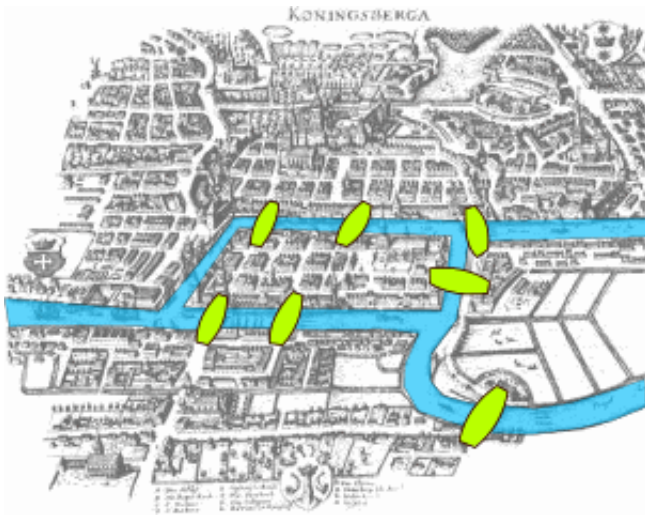


<http://www.wikipedia.org>

History (2)

Konigsberg' bridges (Euler, 1736)

- How to find an *Eulerian Cycle* : chain including 1 once each edge of a graph
- Impossible if odd degree node exists



<http://www.wikipedia.org>

Eulerian and hamiltonian traversals

- Cycle finding
 - **Eulerian** : each edge is included once exactly
 - **Hamiltonian** : each node is included once exactly
- Associated problems
 - *Shortest length Eulerian cycle*
 - **Chinese Postman** : Shortest length cycle including each edge (at least one time)
 - **Travelling Salesman Problem (TSP)** : *Shortest length Hamiltonian cycle*

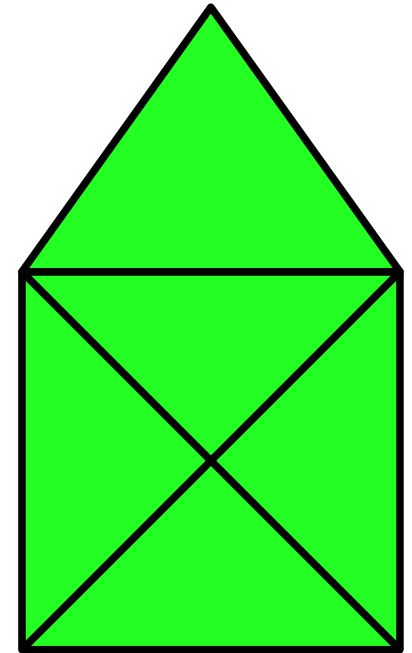
Eulerian traversal

- Euler Theorem

A multigraph includes an eulerian cycle *iff* it is connected and it includes 0 or 2 odd-degree vertices

- Example

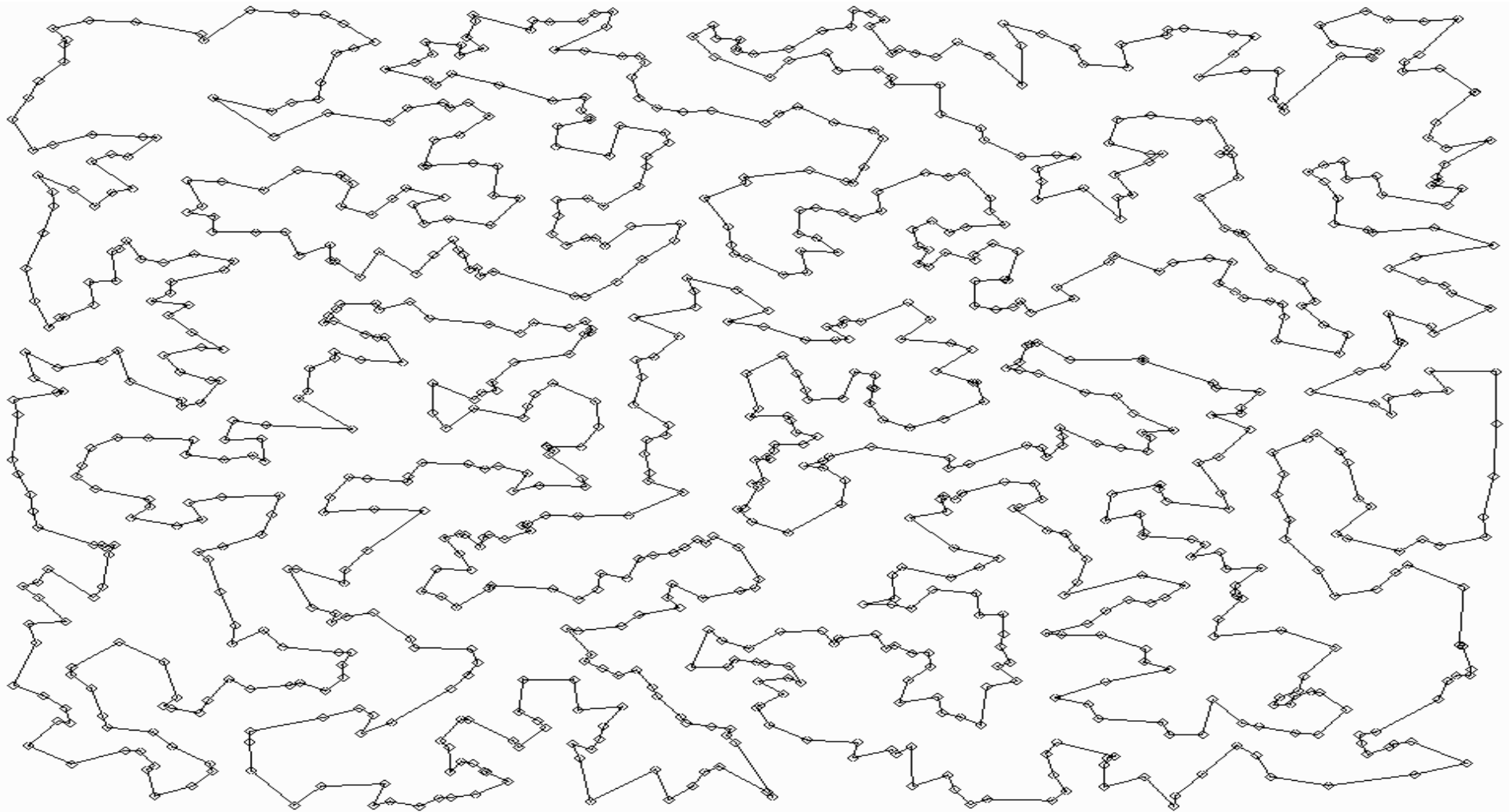
- Draw the hull without lifting your pencil
- Chinese postman : you can draw a line twice



Hamiltonian traversal

- Looking for a shortest length hamiltonian cycle :
Travelling Salesman Problem (TSP)

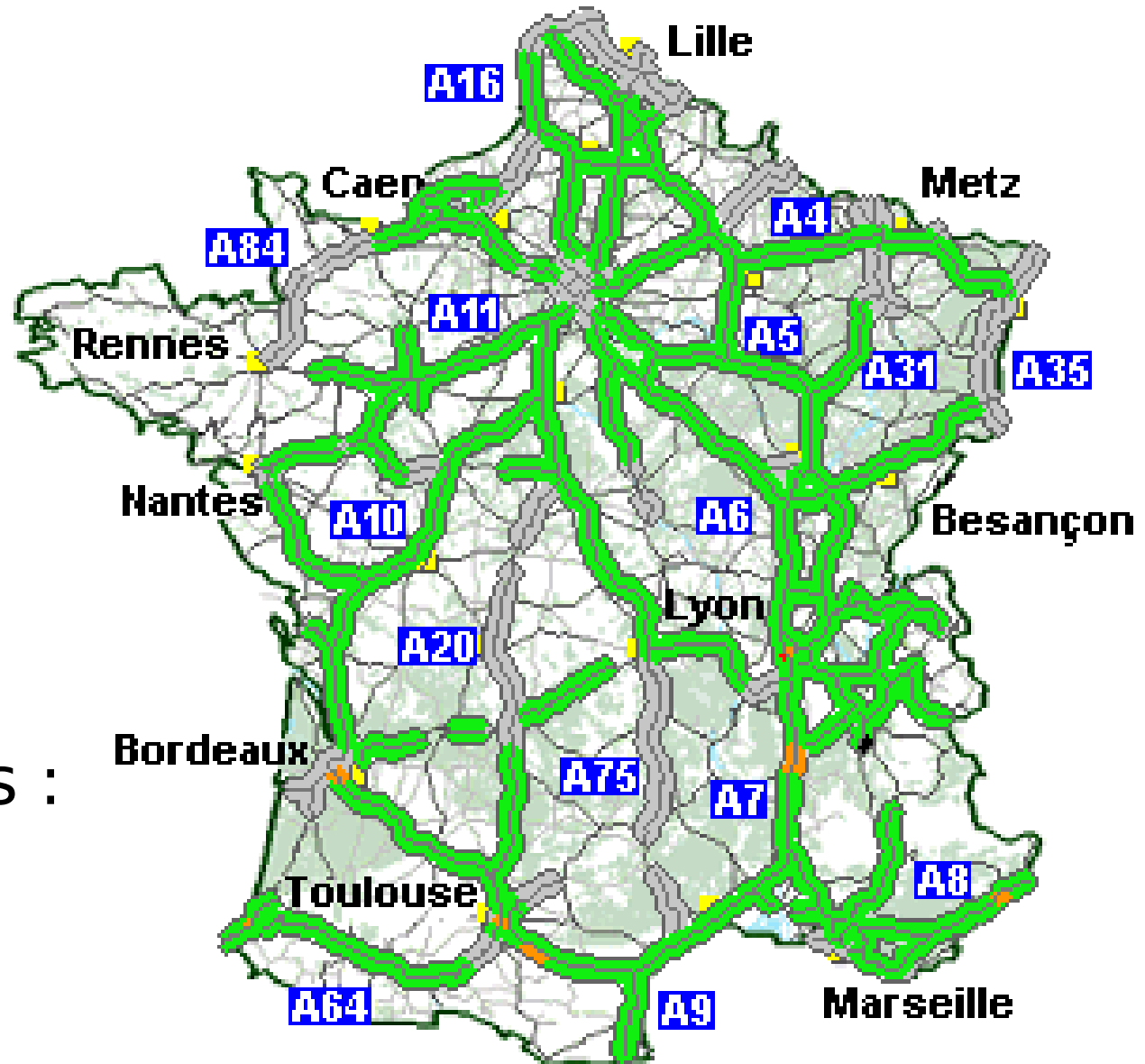
<http://www.cs.berkeley.edu/~bonachea>



A panel of applications

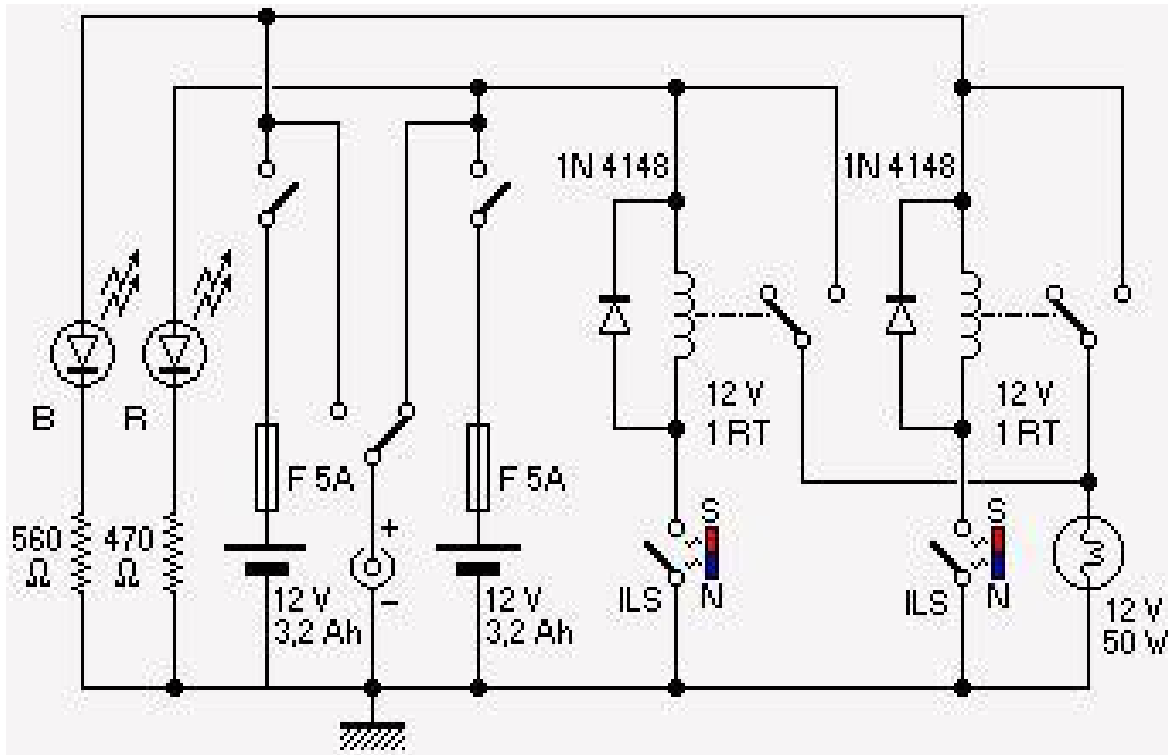
Maps

- Routes
 - *Which way ?*
 - *Which cost ?*
- Routing
 - Geographic
 - Internet
- Hamiltonian cycles :
TSP
- Eulerian cycles :
Chinese Postman



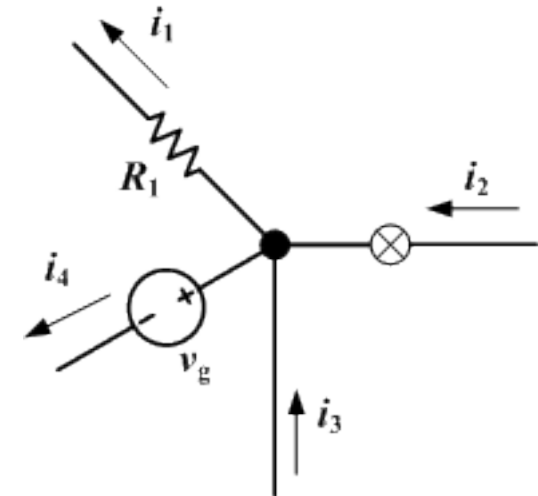
A panel of applications Electrical Circuits

- Junction nodes in electrical circuits



- Kirchoff's point rule

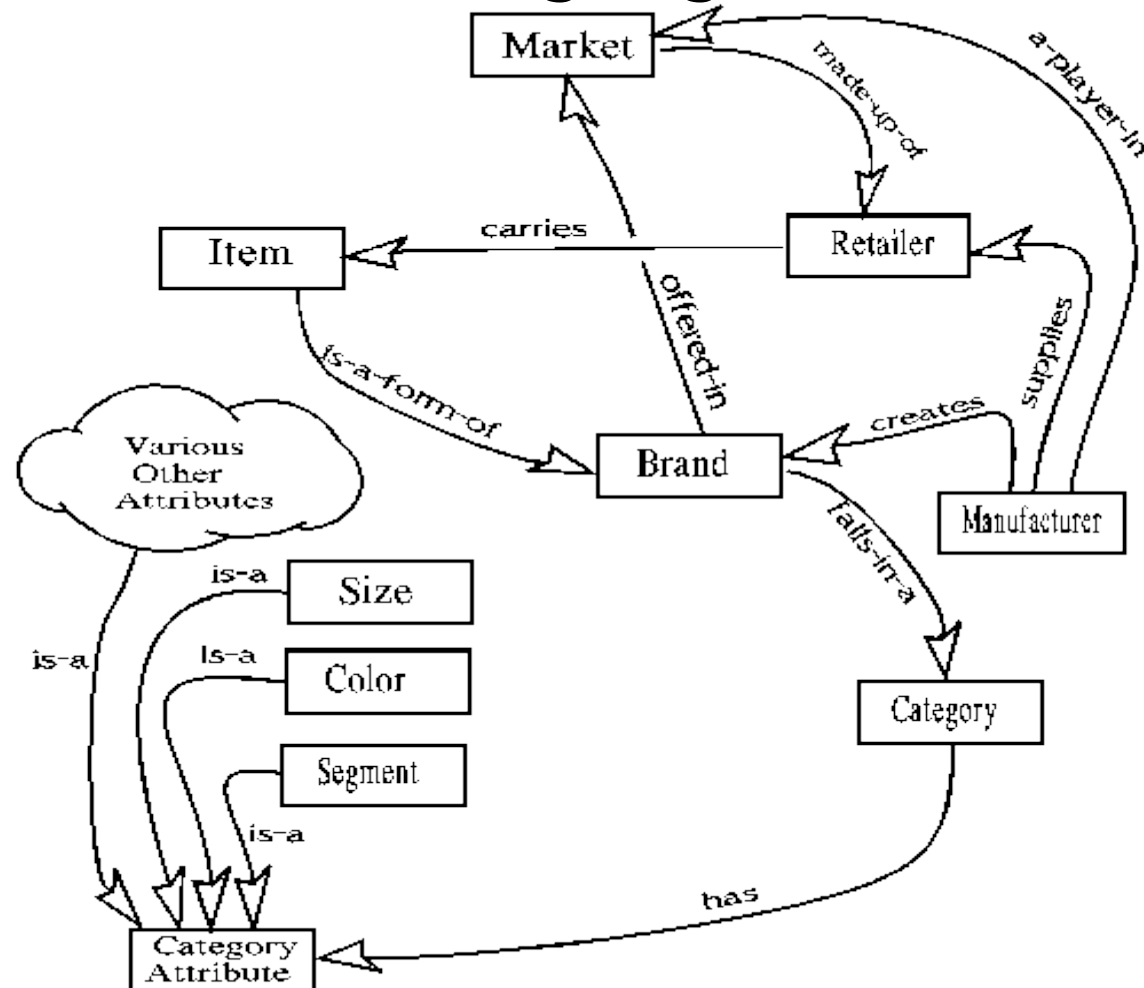
- *Conservation of energy*
- *Conservation of electric charge*



A panel of applications

Semantic network

- Semantic relations between concepts
- Applications in Natural Language Processing



A panel of applications

Project management and scheduling

- Perform activities/tasks

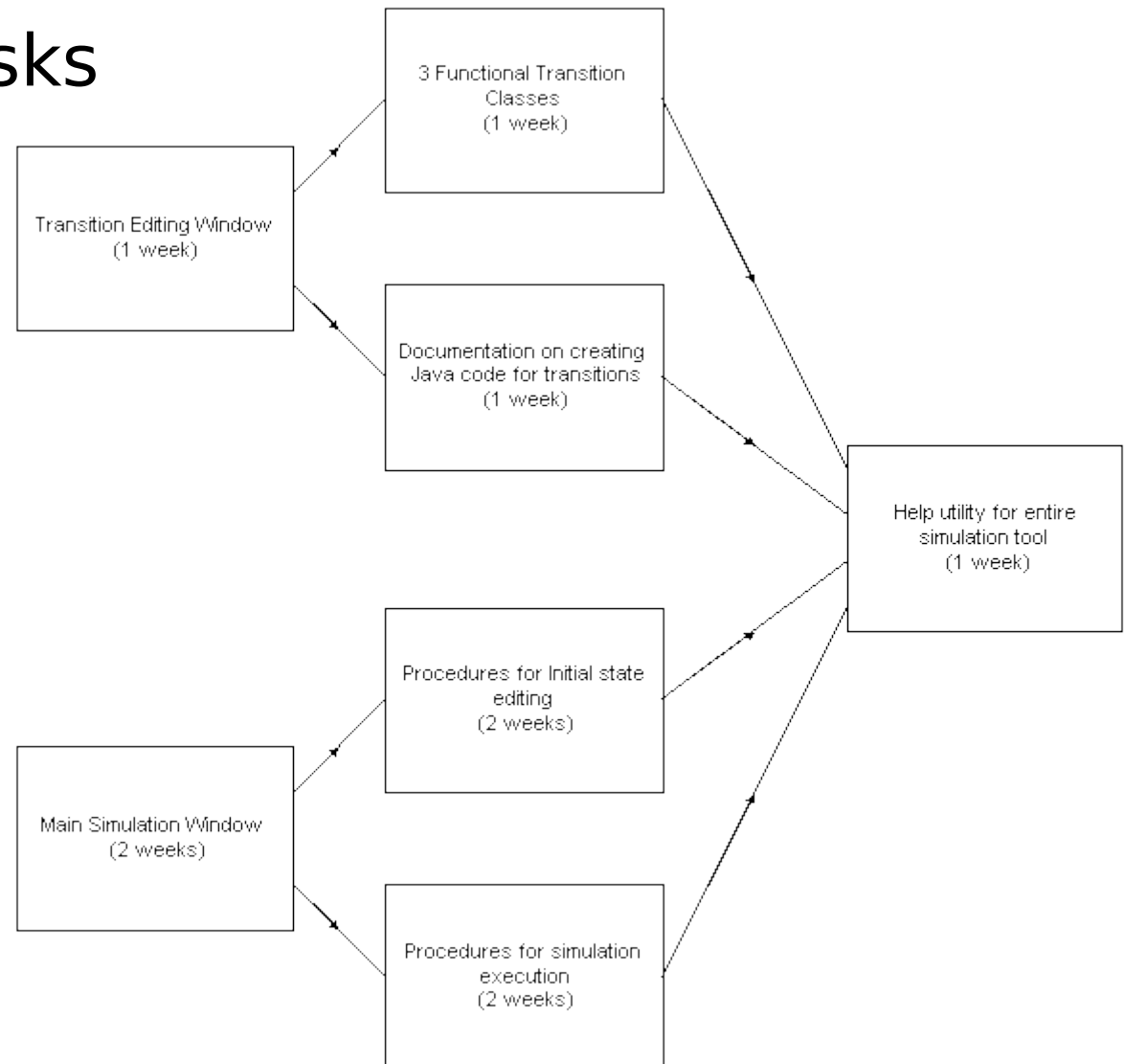
- *Dependancies*
- *Times*

- Longest path time

- Activity network ?

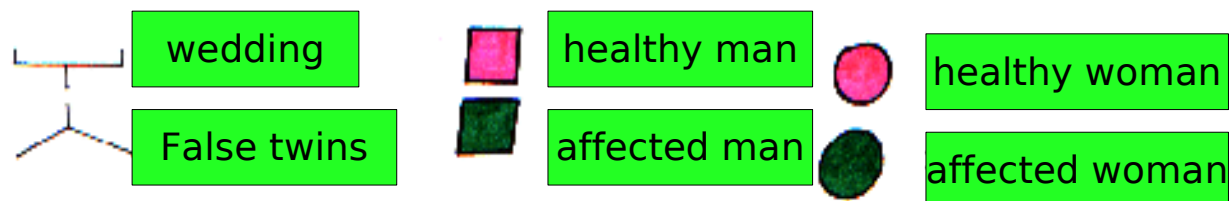
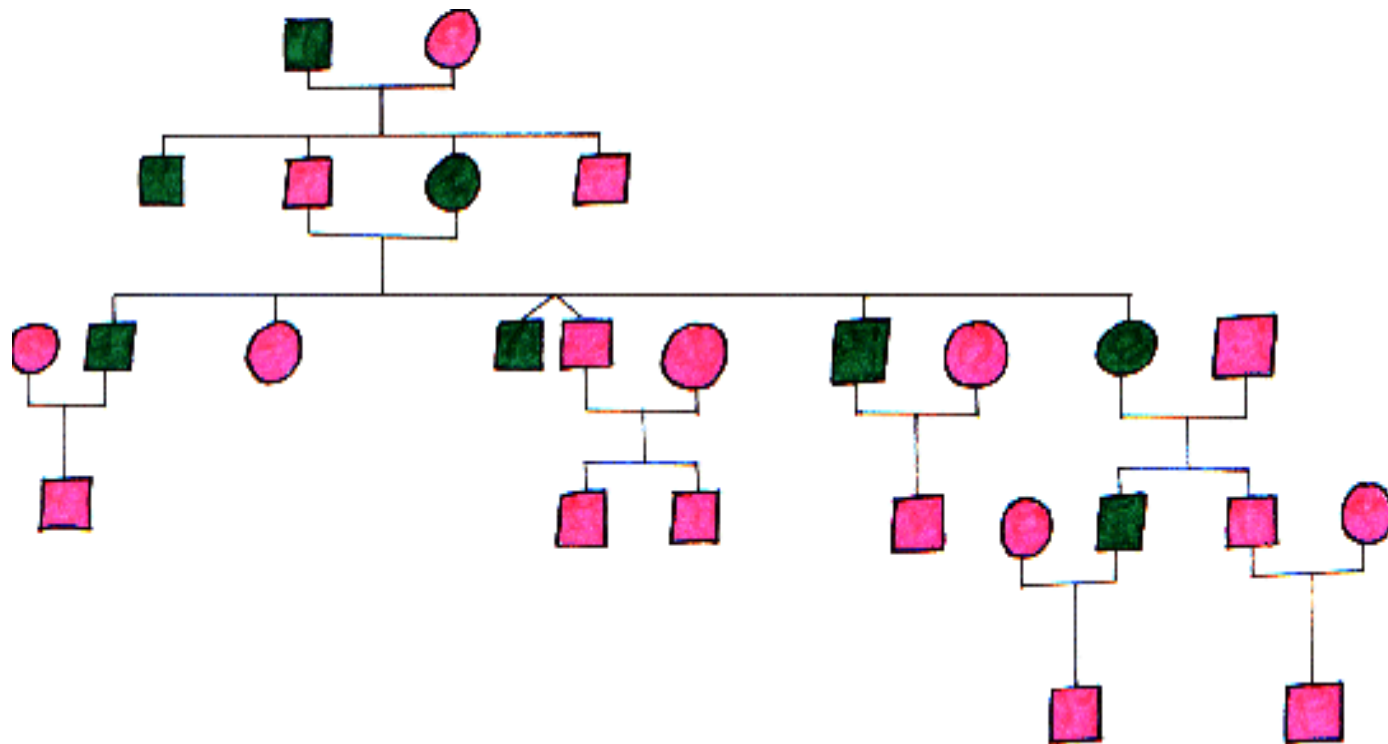
- PERT

- CPM



A panel of applications applications Genealogy

- Particular Graphs : trees
- Genetic diseases



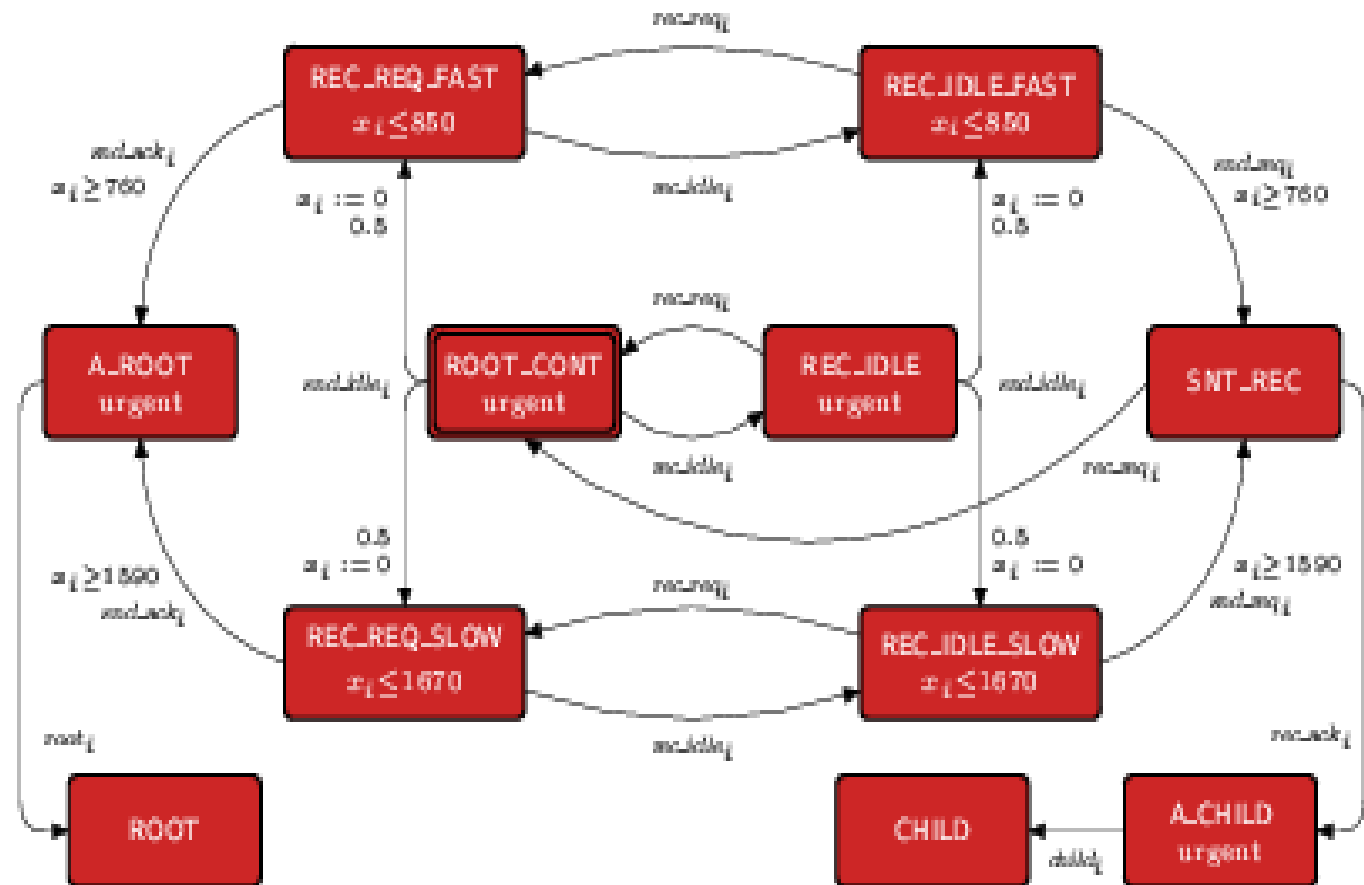
A panel of applications Automata

- Describe a protocol

- TCP
- Telephone
- Traffic lights
- ...

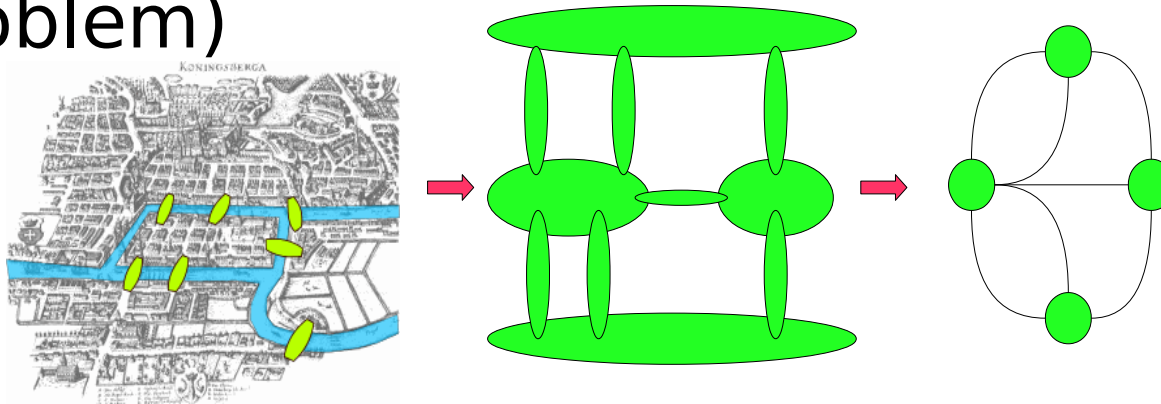
- Concepts

- States
- Transitions

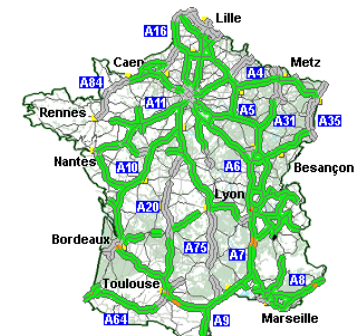
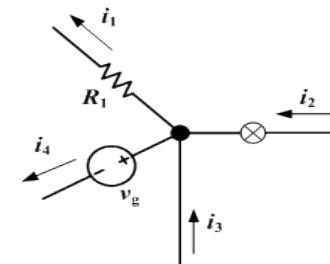


Summary

- Graph conception
 - Modelize problems
 - Graphic representation (help you solving the problem)



- Exploiting the model
 - Check properties
 - Solution optimization

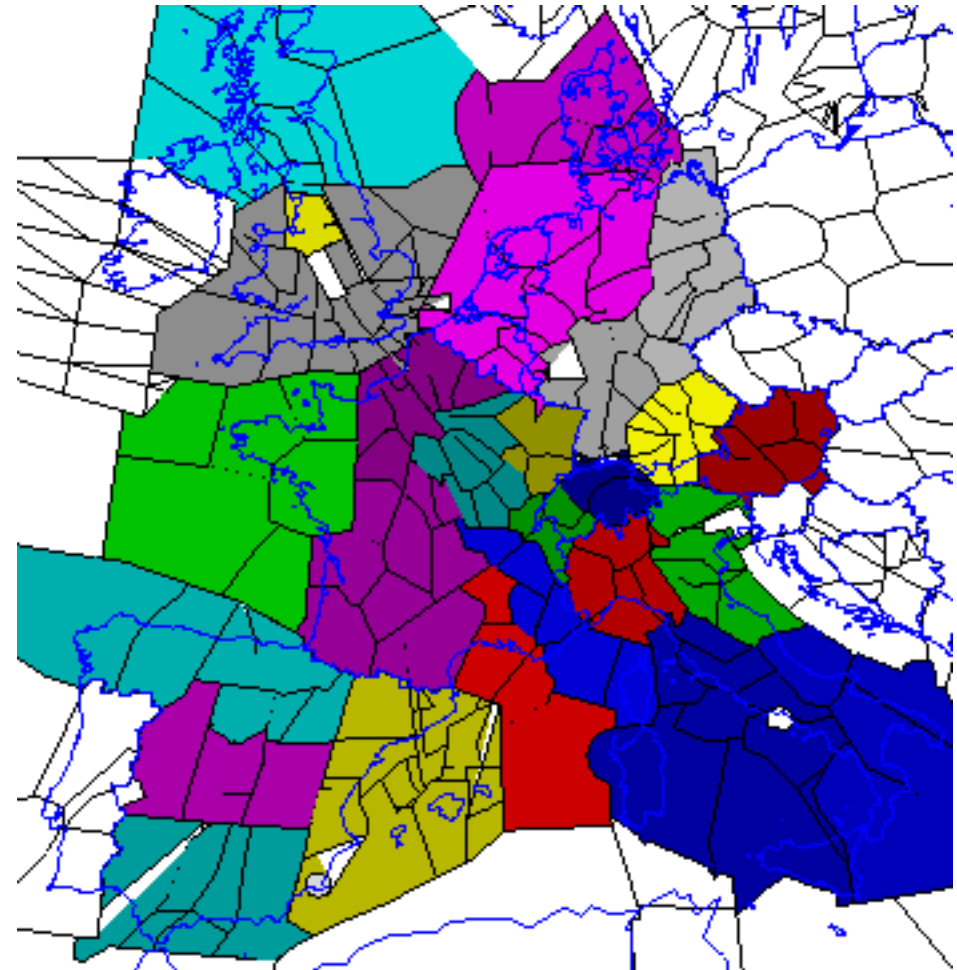


Examples of models

- Air traffic control
 - Minimize screen swaps and equilibrate controllers' amount of work
- VLSI circuits optimization
 - Partition large circuits into smaller ones and re-compute their layout
- Model ?
- Model properties to focus ? What is the optimization criteria ?
- Which algorithm is adapted, how to use it ?

Air traffic control : model

- Given flight level
- Standard altitude for an airplane.
- FL260 is the Flight Level 260
- (26 000 feet, 7 900m approx.).

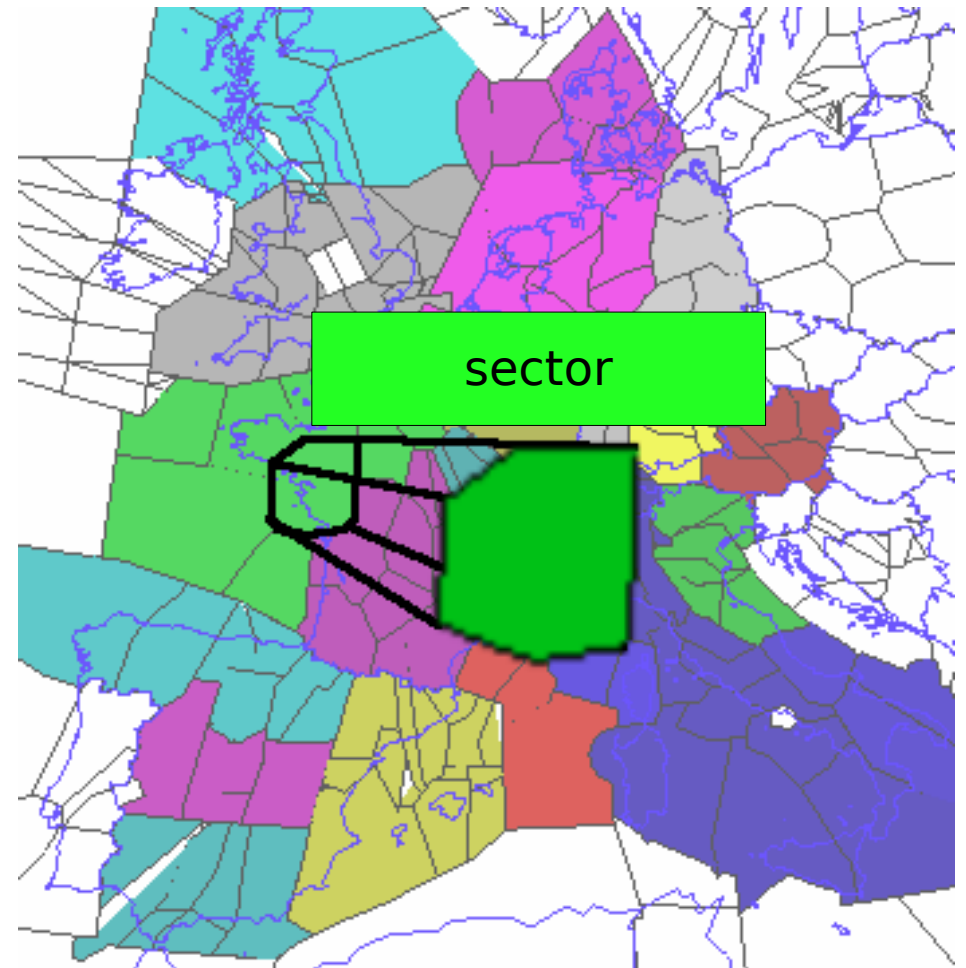


<http://www.emse.fr/spip/IMG/pdf/Bichot-11-05-07.pdf>

Air traffic control : problem

- Sector

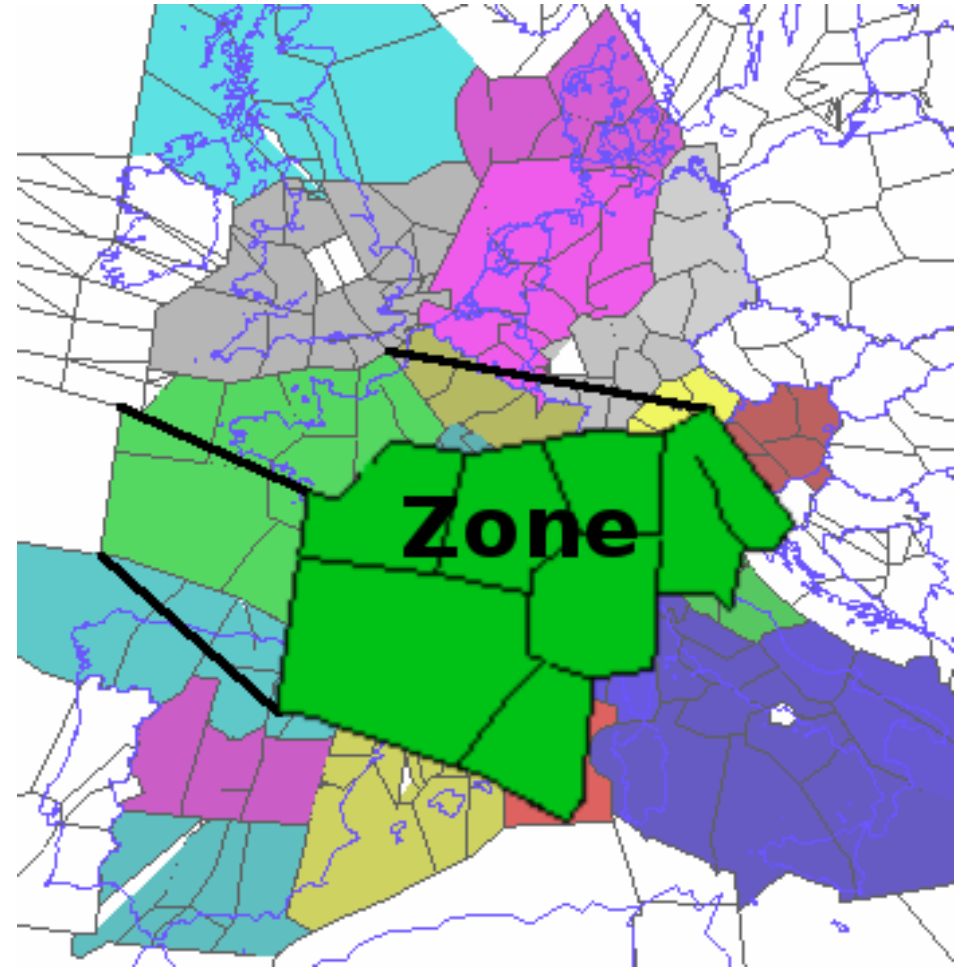
Geographic area under the responsibility of an air traffic controller



Air traffic control : problem

- Qualification zone

A set of sectors for which an air traffic controller is qualified



Air traffic control : goals

Improving safety, fluidity and capacity of the european sky

- Decrease the amount of work of controllers
 - Traffic monitoring
 - Conflicts management (predictive/actual)
 - **Sectors Coordination.**

Space partitioning

- Find a partition $P_k = \{S_1, \dots, S_k\}$ of the nodes of a graph $G(V, E)$:
 - a part = a qualification zone
 - a node = a sector
- There are streams of airplanes between the different sectors : G is connected and weighted
- k , # parts = number of qualification zones
- European sky area :
 $k = 32$ parts, 762 nodes, 10 328 edges.

Outline

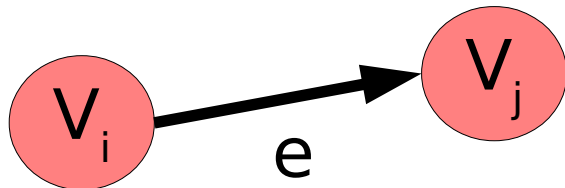
- Relations
- Graph basics
 - Definitions
 - Implementation
 - Traversal
- Optimization algorithms
 - Paths, trees, flow graphs
- Scheduling
 - Definitions
 - PERT and MPM methods

Bibliography

- web
- Algorithmic graph theory
J. A. McHugh, Prentice Hall, 1990

Graphs Terminology

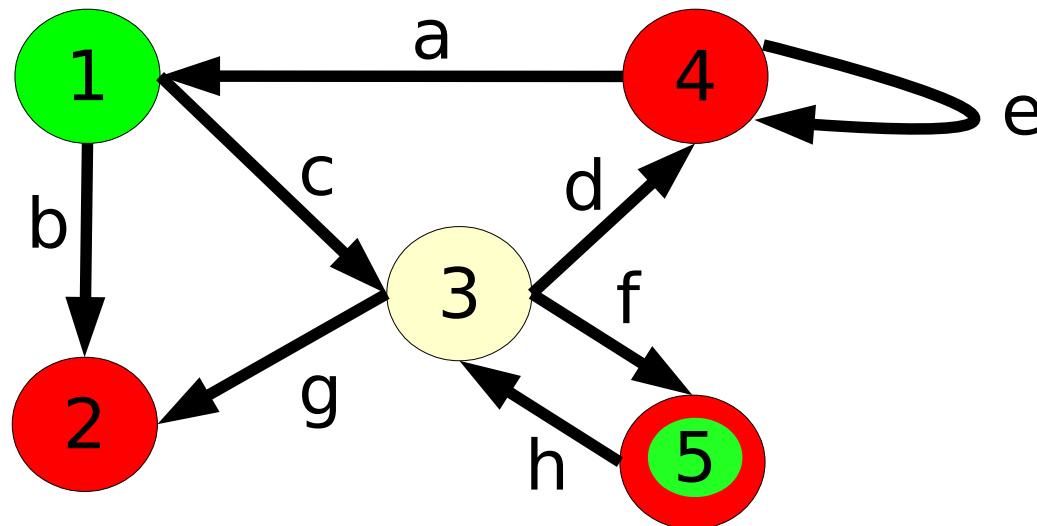
- **Directed Graph (Digraph)** G : 2 sets
 - V : set of **vertices (nodes)** of G
 - E : set of **edges (arcs)** of G
- A directed edge $e \in E$ is an ordered couple (V_i, V_j) of endpoints
 - $V_i \in V$ is the **initial** node (**tail**) of e
 - $V_j \in V$ is the **terminal** node (**head**) of e



E represents a
relation between
 V_i and V_j

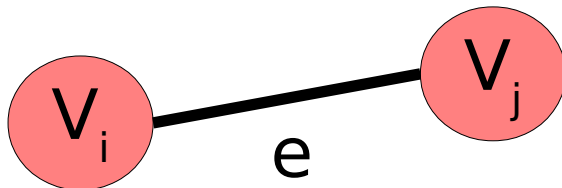
Graphs Terminology

- **order** of $G = (V, E)$: number of nodes $|X|$
- **p-graph** : $\forall V_i, V_j \in V$, each edge set $(V_i \rightarrow V_j)$ has a size $\leq p$
- If $V_i \rightarrow V_j \in E$, V_j is a **direct successor** of V_i and V_i is a **direct predecessor** of V_j



Graphs Terminology

- **Unoriented Graph** $G = (V, E)$
 - V : **edge** set of G
- An edge $e \in E$ is an unoriented couple (S_i, S_j)
 - $V_i, V_j \in V$ are **adjacents**

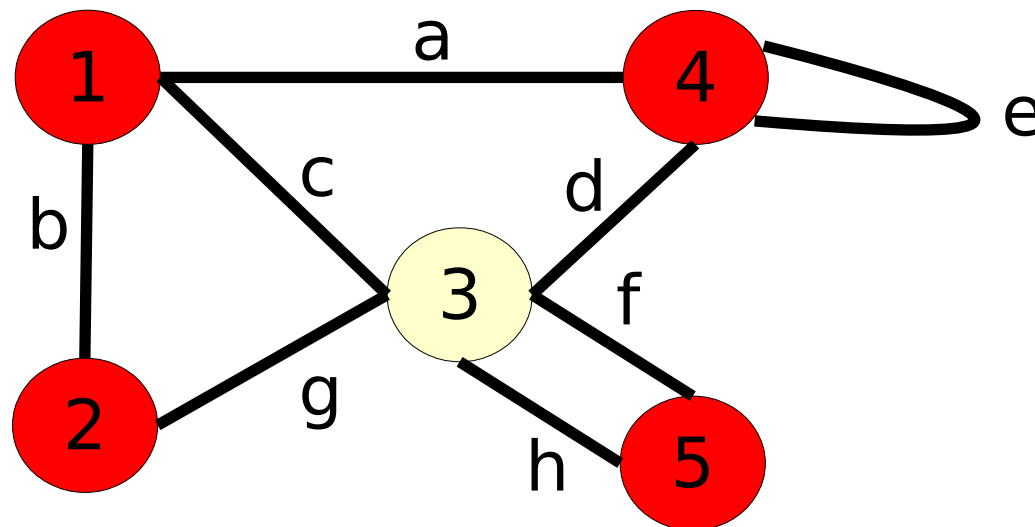


e represents a symmetric relation between S_i et S_j

Graphs

Terminology

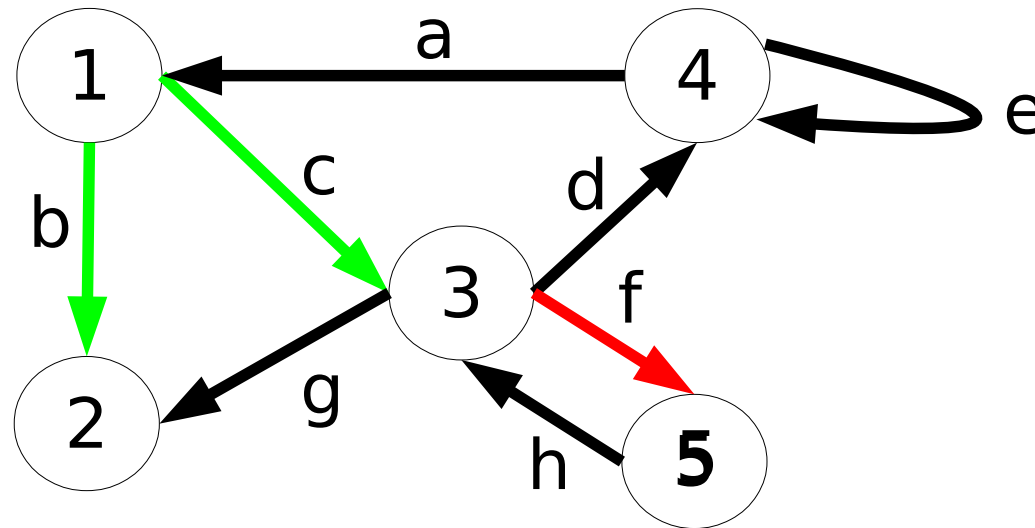
- **multigraph**, more than one edge between at least a couple V_i, V_j
- **simple** graph if at most one edge for each couple V_i, V_j and no loop



Graphs

Terminology

- **degree, half-degrees**, $d^+(S_i) + d^-(S_i) = d(S_i)$
leaving (resp. entering) edges :
out-degree (resp. in-degree) of V_i



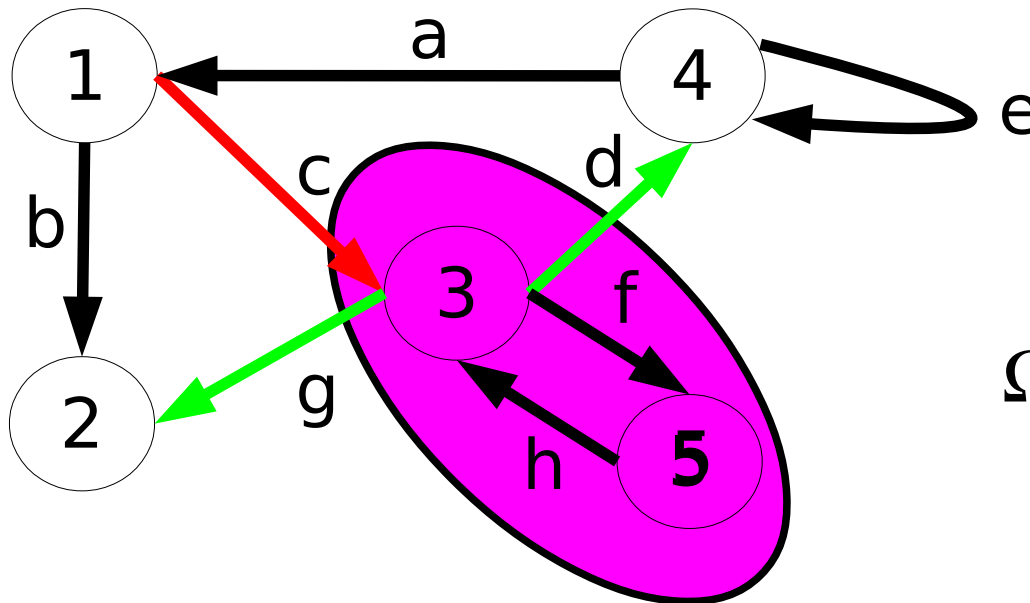
- $d^+(S_1) = 2$; $d^-(S_5) = 1$

Graphs Terminology

- **Positive Cocycles of $A \subseteq V$**

- $\Omega^+(A) = \{ e \in E \mid \text{tail}(u) \in A \wedge \text{head}(u) \notin A \}$

- $\Omega^-(A) = \{ e \in E \mid \text{tail}(u) \notin A \wedge \text{head}(u) \in A \}$



$$\Omega(A) = \Omega^+(A) \cup \Omega^-(A)$$

- $\Omega^+(A) = \{d, g\}$; $\Omega^-(A) = \{c\}$

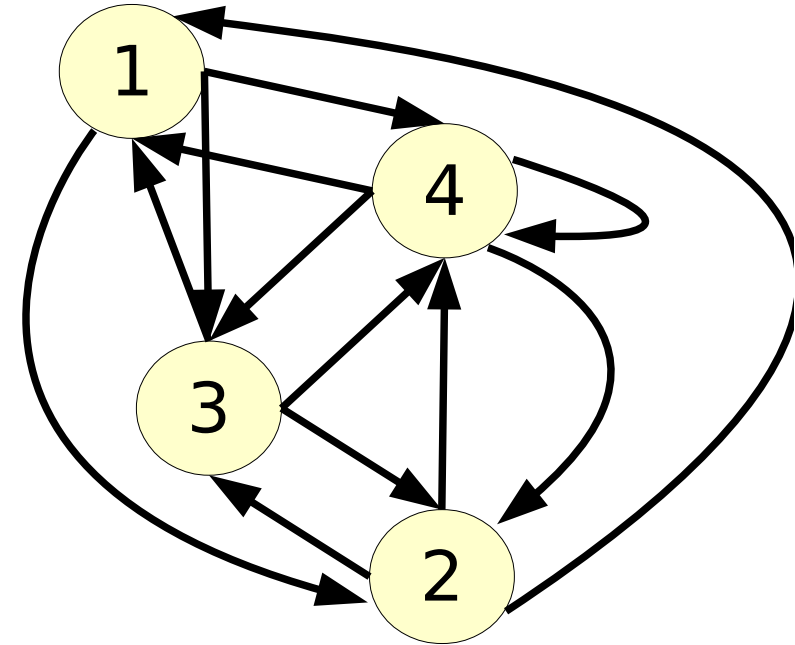
Graphs Terminology

- **Complete graph, clique**

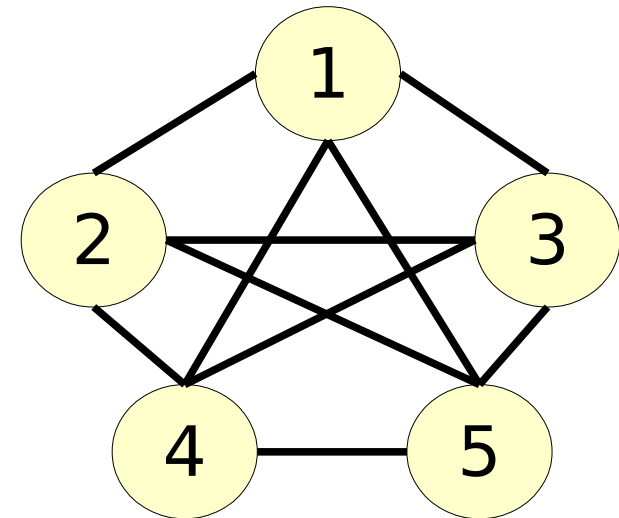
- $G = (V, E)$ is complete iff

- $\forall V_i, V_j \in V^2, i \neq j,$

- $\exists \text{ edge } e = (V_i \rightarrow V_j) \in E$



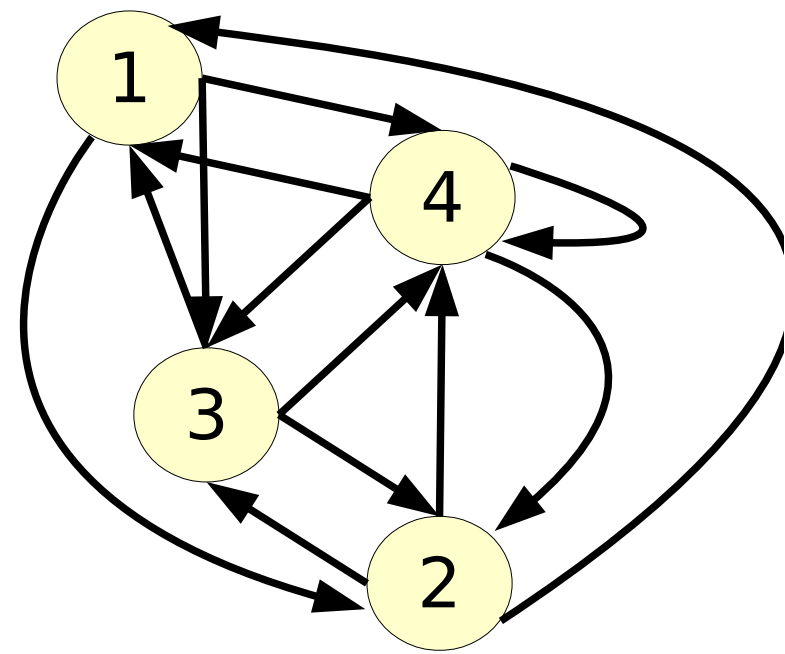
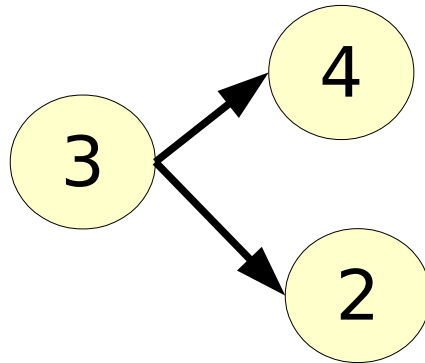
- **Clique** for unoriented graphs



Graphs Terminology

- **Subgraph**

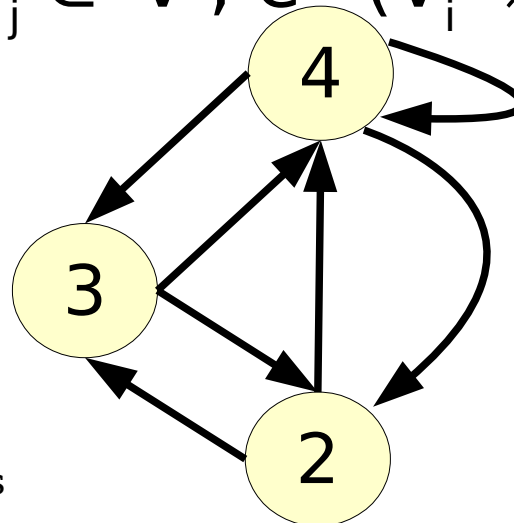
$G' = (V', E')$ is a subgraph of $G = (V, E)$ iff $V' \subseteq V \wedge E' \subseteq E$



- Subgraph $G' = (V', E')$ **generated by** $V' \subseteq V$:

$E' = \{e \in E \mid \exists V_i, V_j \in V', e = (V_i \rightarrow V_j) \text{ or } e = (V_j \rightarrow V_i)\}$

$V' = \{V_2, V_3, V_4\}$



Graphes

Terminology

- **Directed path in $G = (V, E)$**

$C = e_1, e_2, \dots, e_m$ with

$e_1, e_2, \dots, e_m \in E$

is a directed path *iff*

$\forall a \in]1..m]$,

$\text{tail}(e_a) = \text{head}(e_{a-1})$

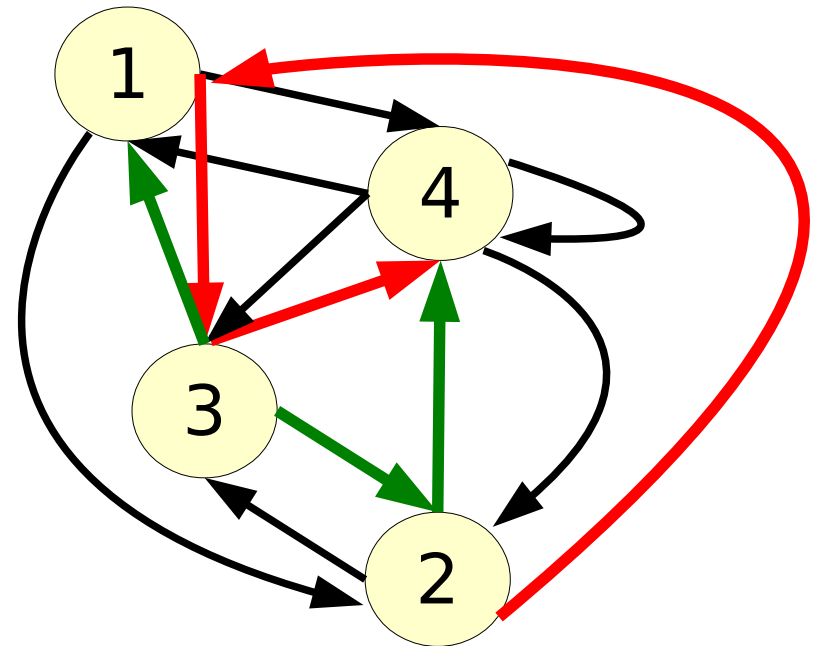
- **Path in $G = (X, U)$**

$C = e_1, e_2, \dots, e_m$ with

$e_1, e_2, \dots, e_m \in E$

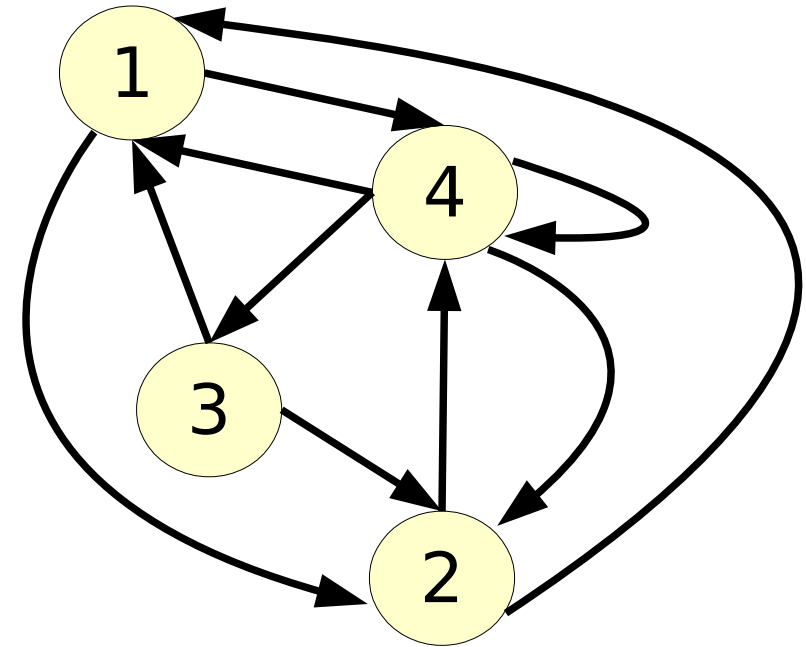
is a path *iff*

$\forall a \in]1..m]$, e_a and e_{a-1} are adjacent

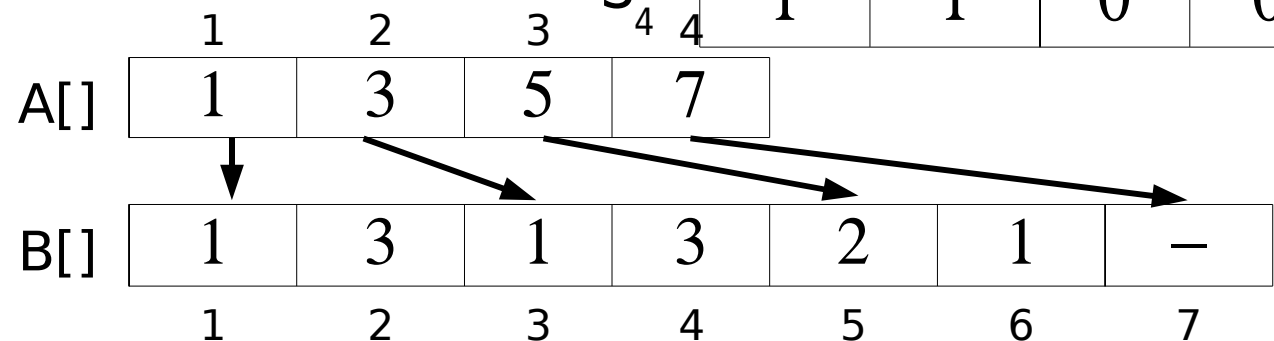


Graphs Implementation

- $G = (V, E)$
in computer memory
- Matrix
 - Node-arc incidence
 - Node-edge incidence
 - adjacency
- Lists
 - Adjacency
 - Incidency
 - Cocycles



	S_1	S_2	S_3	S_4
S_1	1	0	0	1
S_2	0	1	1	0
S_3	0	0	1	1
S_4	1	1	0	0



Digraph implementation

Node-arc Matrix

- $G = (V, E)$

$$\forall e = (V_i \rightarrow V_j) \in E$$

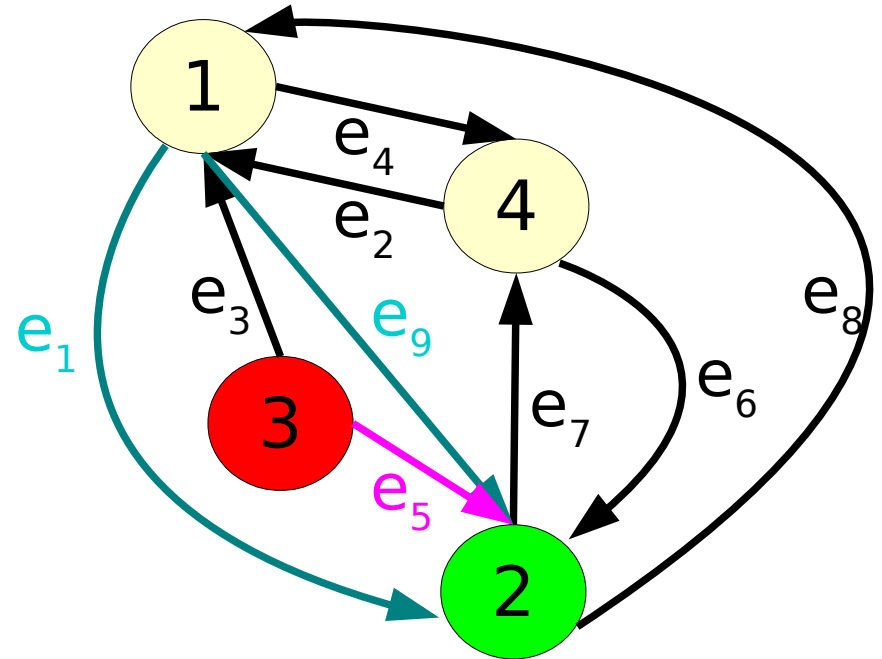
$$\begin{cases} A_{ie} = 1 \\ A_{je} = -1 \\ \forall x \neq i \text{ and } j, A_{xe} = 0 \end{cases}$$

- Loops ?

- Memory footprint
 $|X| \times |U|$

- Node-edge matrix for graphs

$$A_{ie} = A_{je} = 1$$

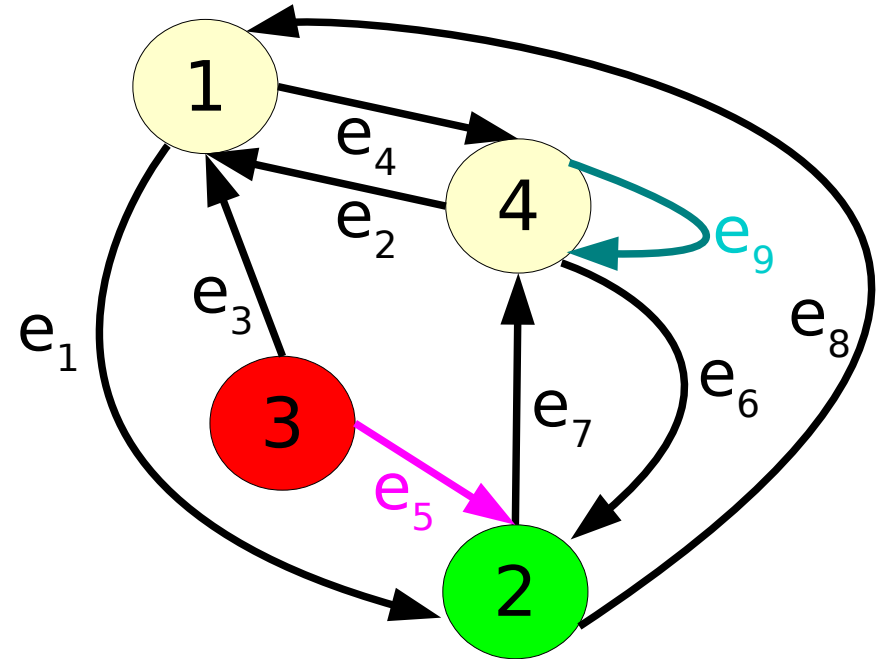


	e_1	e_2	e_3	e_4	e_5	e_6	e_7	e_8	e_9
V_1	1	-1	-1	1	0	0	0	-1	1
V_2	-1	0	0	0	-1	-1	1	1	-1
V_3	0	0	1	0	1	0	0	0	0
V_4	0	1	0	-1	0	1	-1	0	0

Digraph implementation

Node-node matrix

- $G = (V, E)$
 $\forall e = (V_i \rightarrow V_j)$
 - $e \in E \Rightarrow A_{ij} = 1$
 - $e \notin E \Rightarrow A_{ij} = 0$



- Memory footprint $|X|^2$
- Multi-graphs ?

	V_1	V_2	V_3	V_4
V_1	0	1	0	1
V_2	1	0	0	1
V_3	1	1	0	0
V_4	1	1	0	1

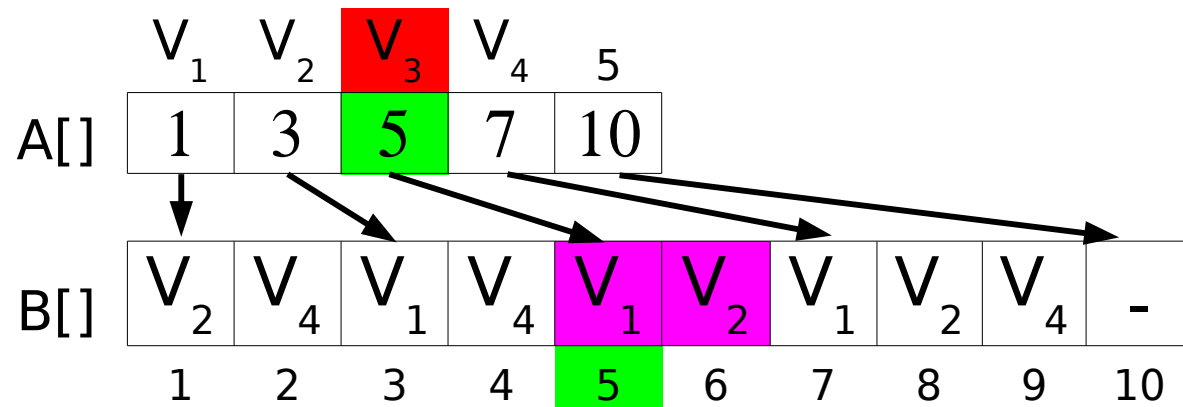
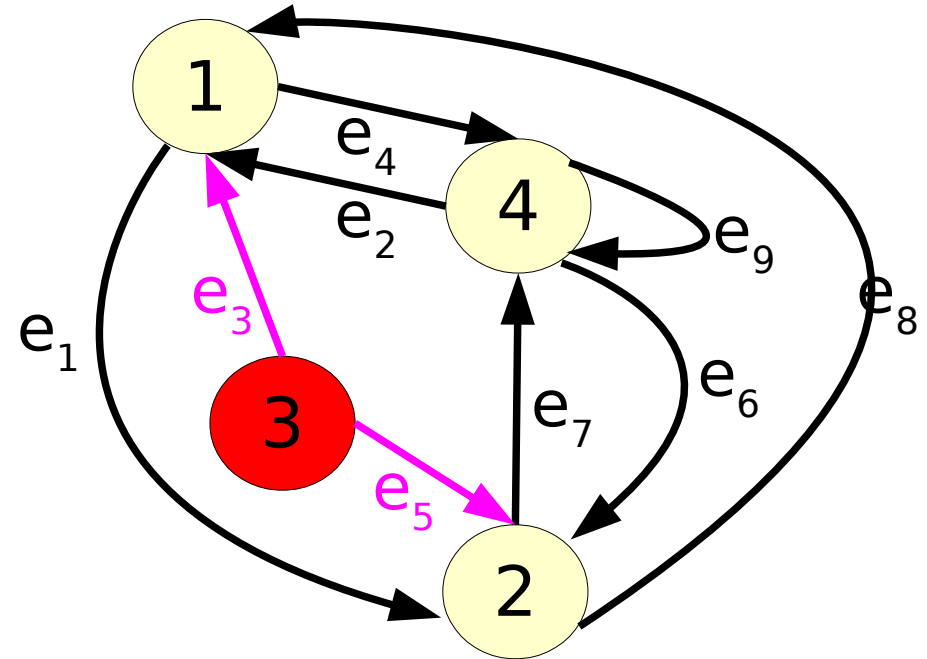
Implementation Adjacency list

- $G = (V, E)$ (1-graph)
 - 2 arrays A and B
- B[] contains, starting at A[i] index, the list of nodes adjacent to V_i
- Properties :

$$d^+(V_i) = A[i+1] - A[i]$$

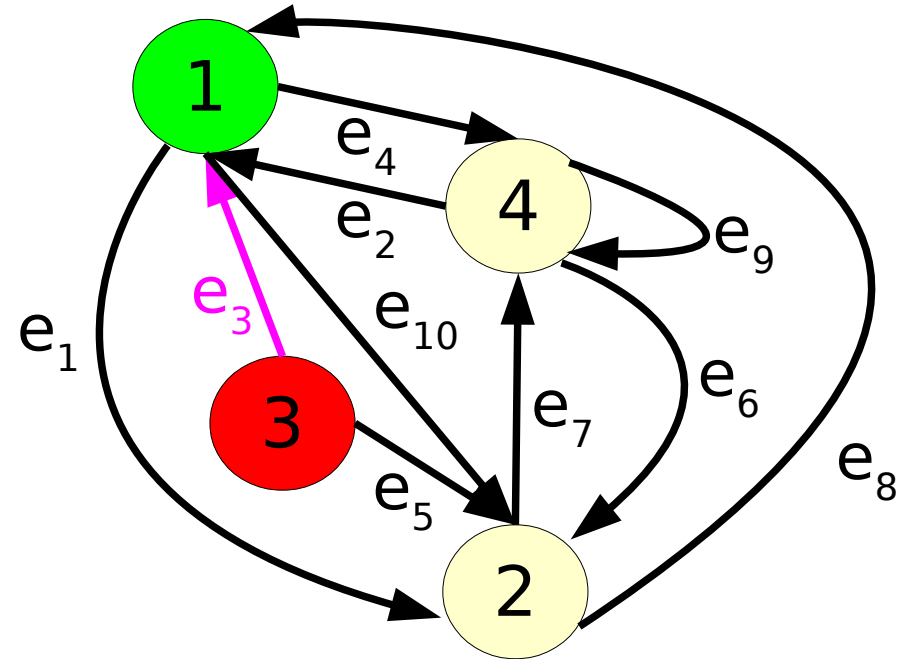
$$A[i] = \sum_{j=1}^{i-1} d^+(V_j) + 1$$

- Memory footprint $|X| + |U|$



Implantation Arc List

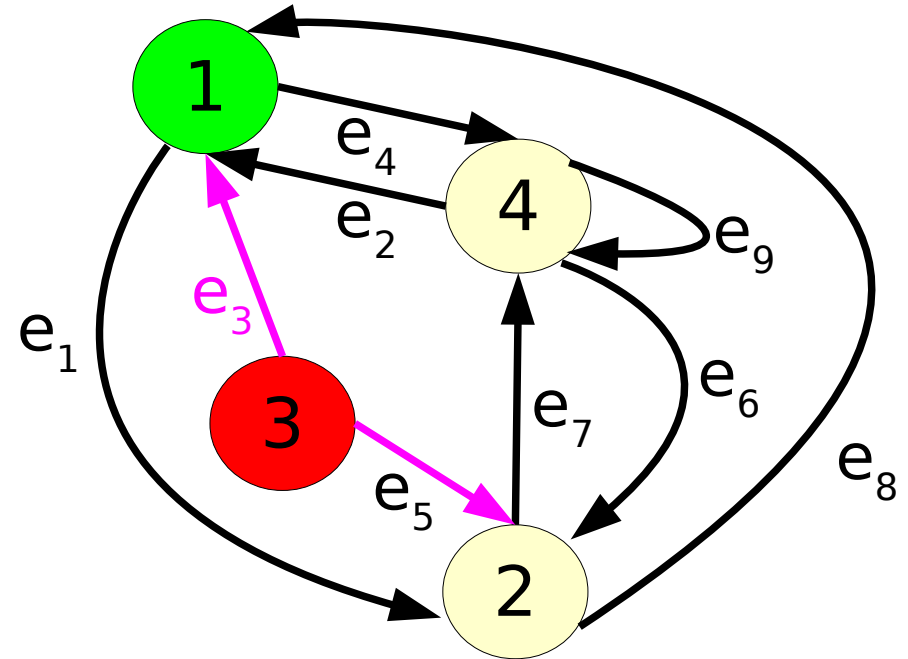
- $G = (V, E)$
 - 2 arrays $T[]$ and $H[]$
- $T[e]$ contains the tail of edge e , $H[e]$ the head node of edge e
- Any kind of graph
- Footprint $2 * |E|$



	e_1	e_2	e_3	e_4	e_5	e_6	e_7	e_8	e_9	e_{10}
$H[]$	1	4	3	1	3	4	2	2	4	2
$T[]$	2	1	1	4	2	2	4	1	4	1

Implantation Cocycles list

- $G = (V, E)$
 - 2 arrays LP[] et LE[]
- LE[] contains, starting at index LP[i], the list of edges leaving node V_i (positive cocycle $\Omega^+(V_i)$)
- LH[] contains the associated list of heads
- Footprint $|X| + 2 * |U|$

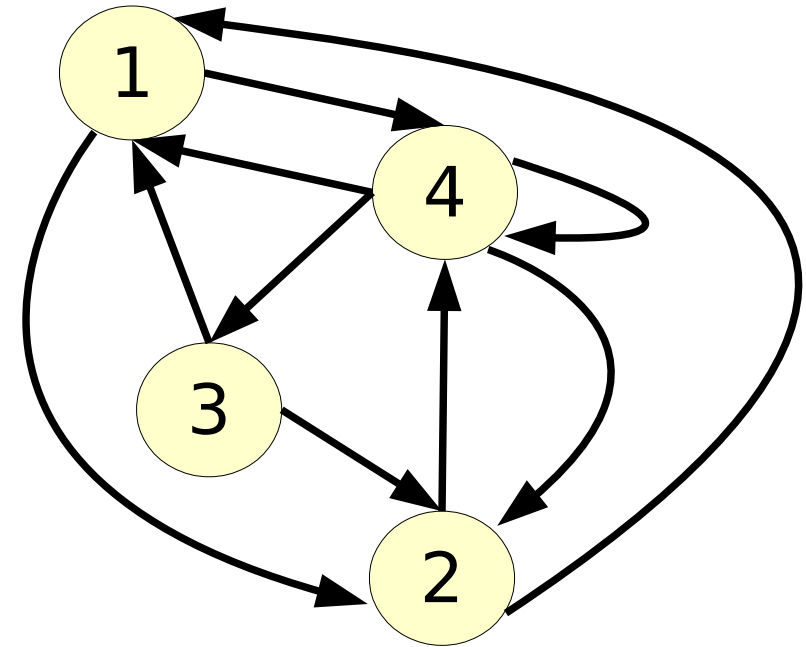


	V_1	V_2	V_3	V_4	5					
LP[]	1	3	5	7	10					
LE[]	e_1	e_4	e_7	e_8	e_3	e_5	e_2	e_6	e_9	-
LH[]	V_2	V_4	V_4	V_1	V_1	V_2	V_1	V_2	V_4	-
	1	2	3	4	5	6	7	8	9	10 ³⁸

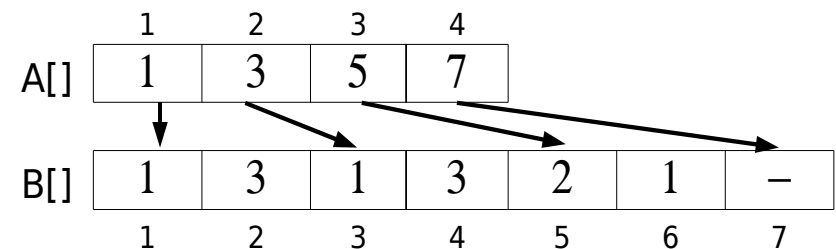
Graphes

Design choice

- $G = (V, E)$
 - Kind of graph
 - Kind of application
- Matrix
 - Huge memory
 - Pre-computed results
- Lists
 - More computations needed
 - Compact footprints



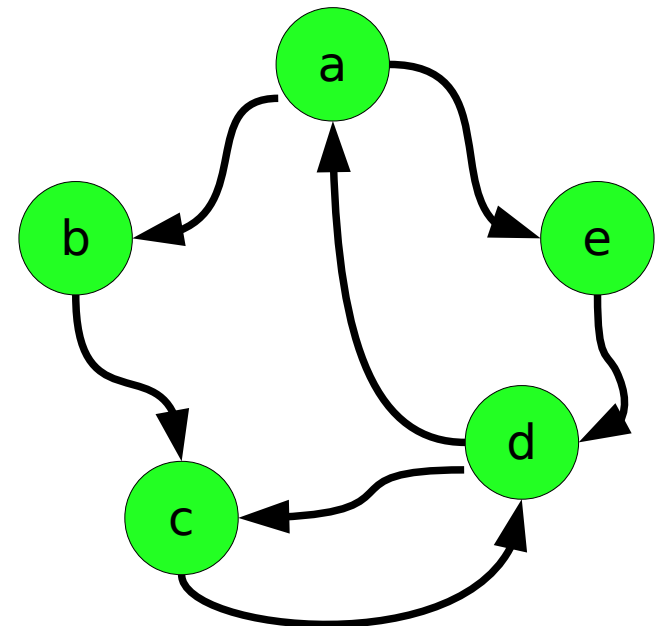
	S_1	S_2	S_3	S_4
S_1	1	0	0	1
S_2	0	1	1	0
S_3	0	0	1	1
S_4	1	1	0	0



Graph search

- Data : some graph $G = (V, E)$
- Goal : How to visit all of the graph's nodes once ?
- Applications : find a data, print the nodes ...

- Example : is there a node named c ?



Depth First Search Algorithm

DFS(Graph G; Node V)()

Node N

List adjList

Si $\text{Open}(V, G) = \text{true}$

Visit(V, G)

adjList \leftarrow ListOfAdjacentNodes(V, G)

Foreach N in adjList

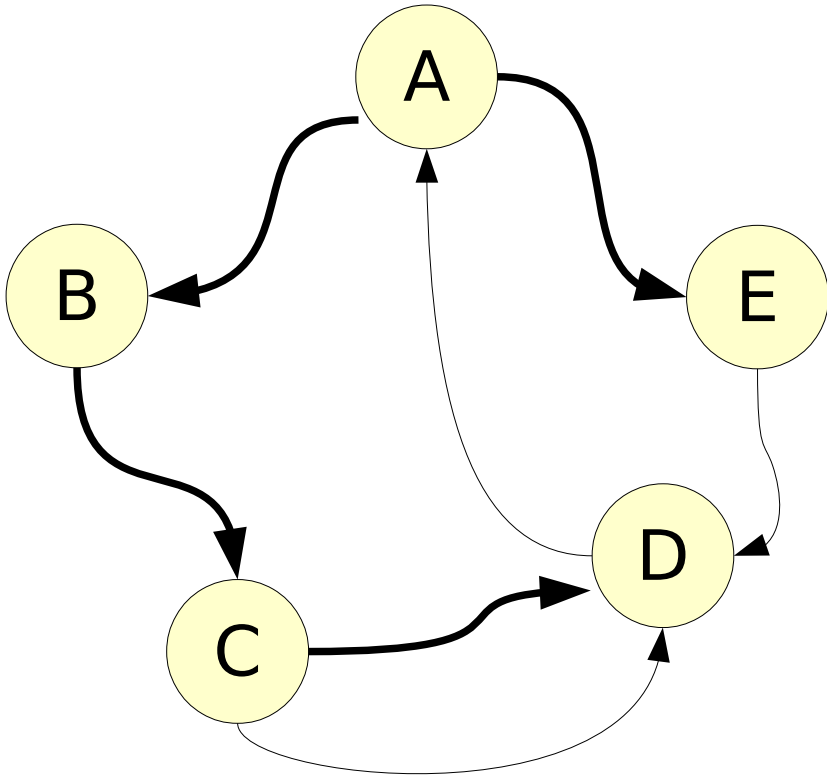
Si $\text{Open}(N, G) = \text{true}$

dfs(G, N)

Depth First Search Algorithm

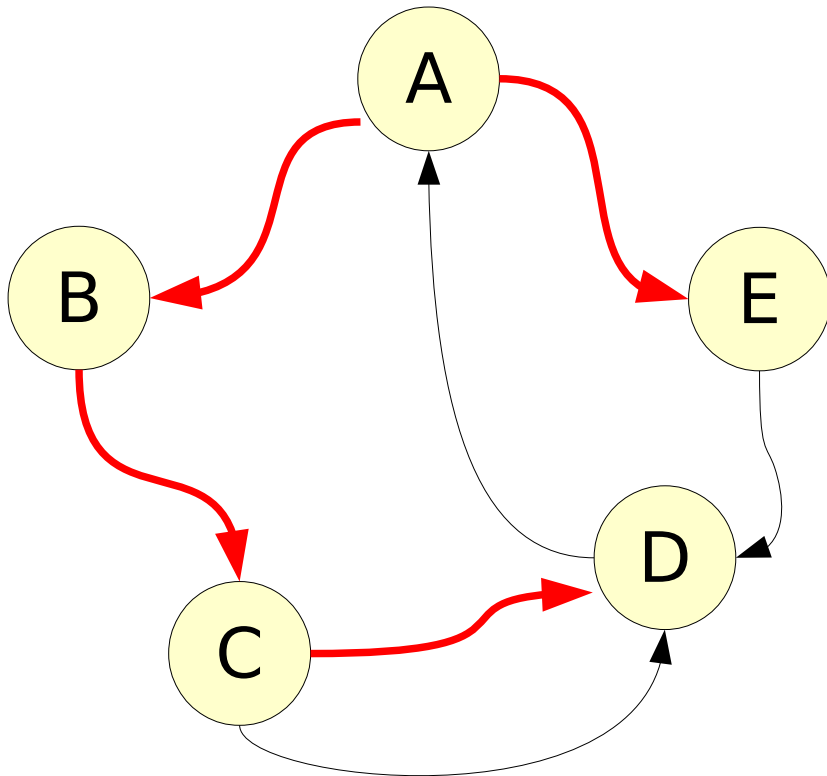
- With subfunctions :
 - Visit(Node V ; Graph G)
does some operation on V and closes it.
 - Open(Node V ; Graph G) (boolean)
returns true if V is open and false if it is closed.

Example



#	Ancestors & current node	adjacent nodes

Example

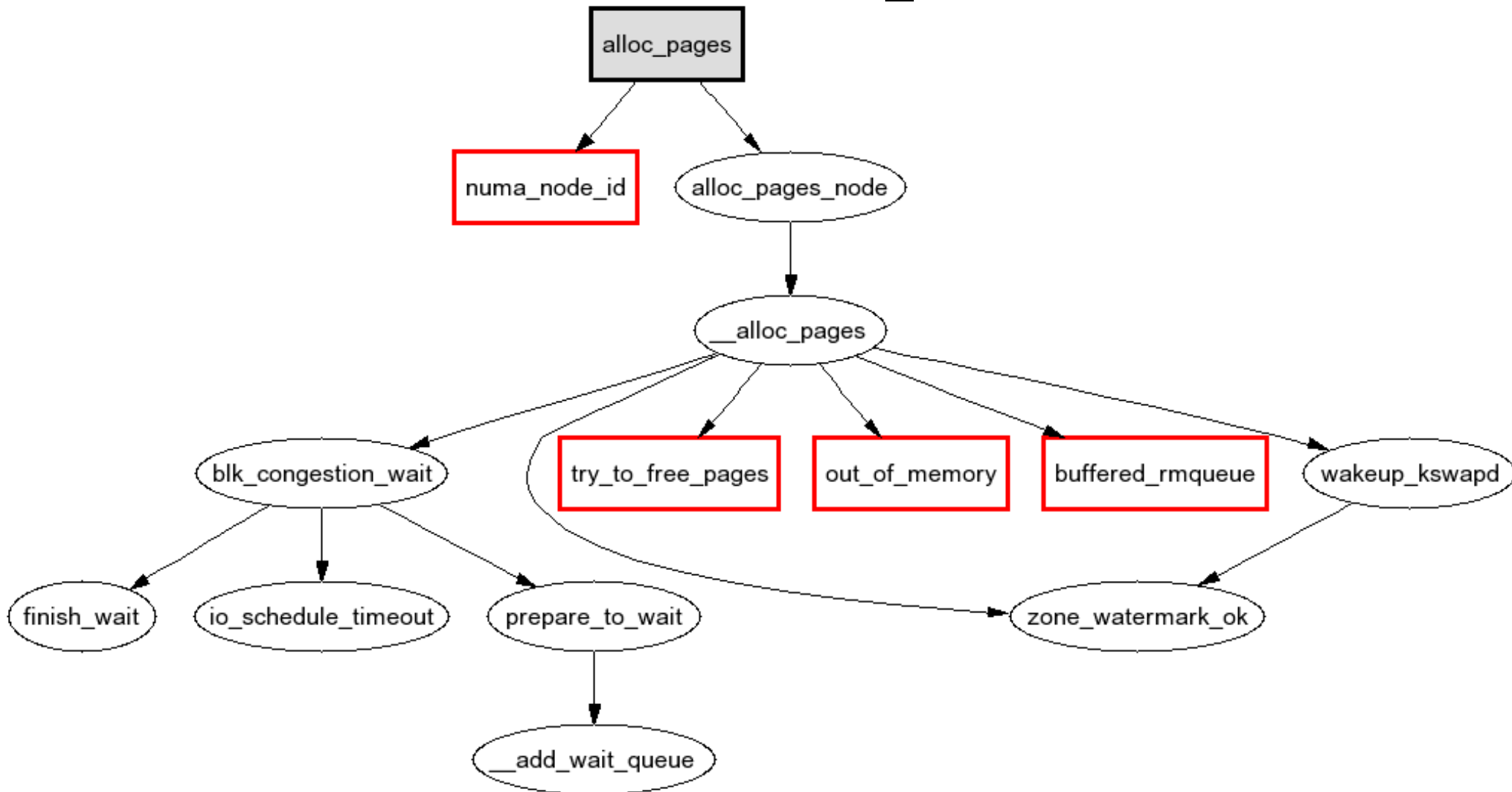


#	Ancetors & current node	adjacent nodes
1	A	B E
2	A B	C
3	A B C	D
4	A B C D	A
5	A B C	D
6	A B	C
7	A	B E
8	A E	D
9	A	B E
10	-	-

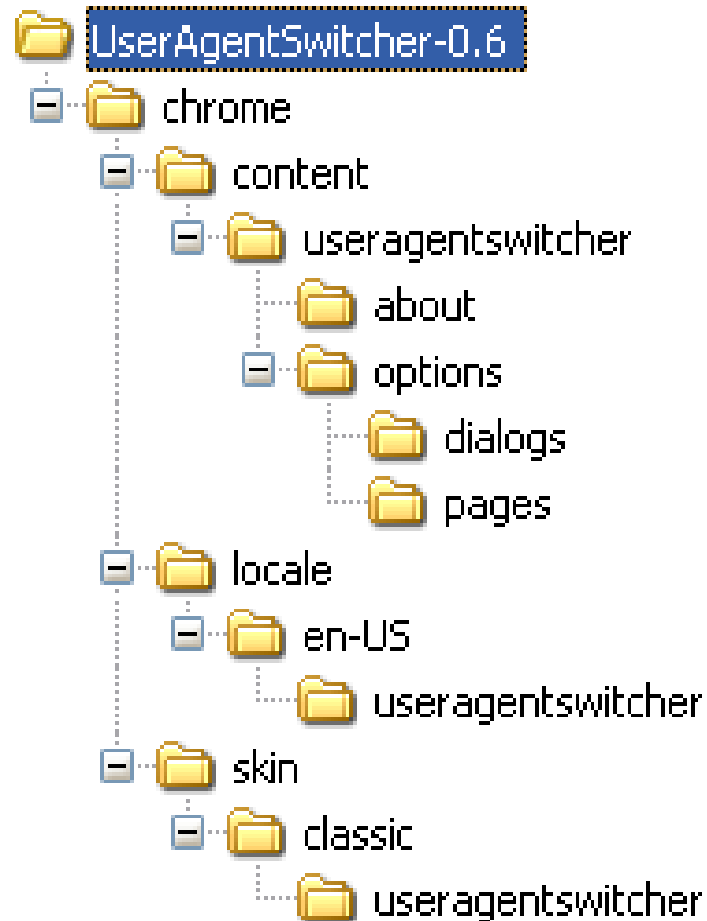
 Spanning tree

Applications

Is finish_wait called by alloc_pages ?



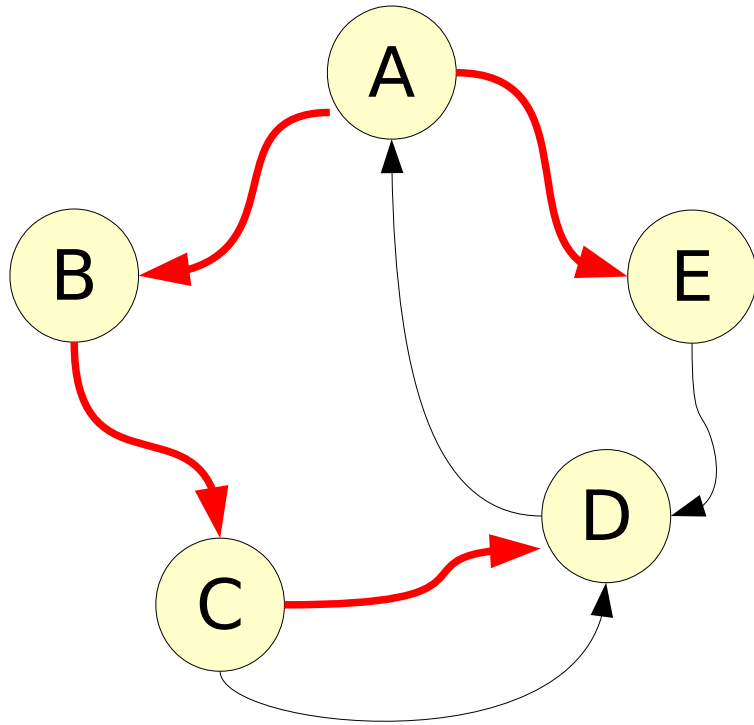
Applications




Which directories need to be backed up ?

Remarks

- The choice between open nodes is free
→ variable visiting order



- If there is no path $V_0 \rightarrow V$, then V is not visited
→ connected component
- Spanning tree 
- Exploring adjacent nodes before successor nodes
→ breadth first walk

Breadth first search

- Same node marking principle as for depth first algorithm
- You visit V_0 then all of its adjacent open nodes. And next the open nodes of these, *etc.*
- Applications : data mining, nodes printing ...
- Stack for yet unexplored nodes

Breadth first Search algorithm

BFS(Graph G; Node V_0)()

Node N

Stack S

List adjList

push(V_0 , S)

visit(V_0 , G)

While not empty(S)

pop(N, S)

adjList \leftarrow listOfAdjNodes(N, G)

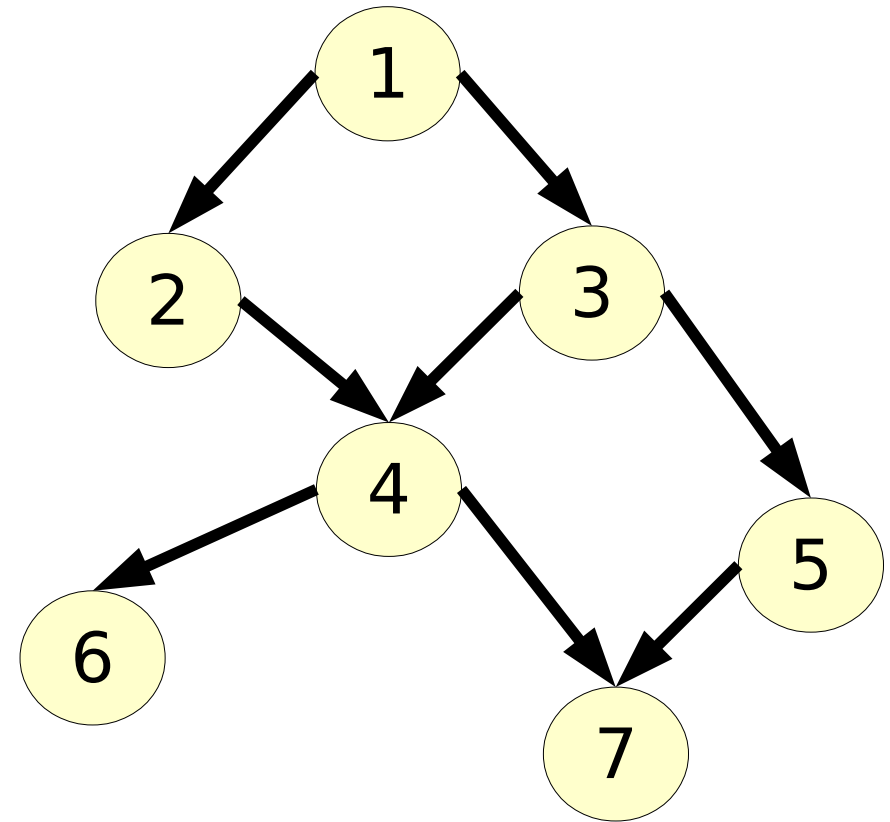
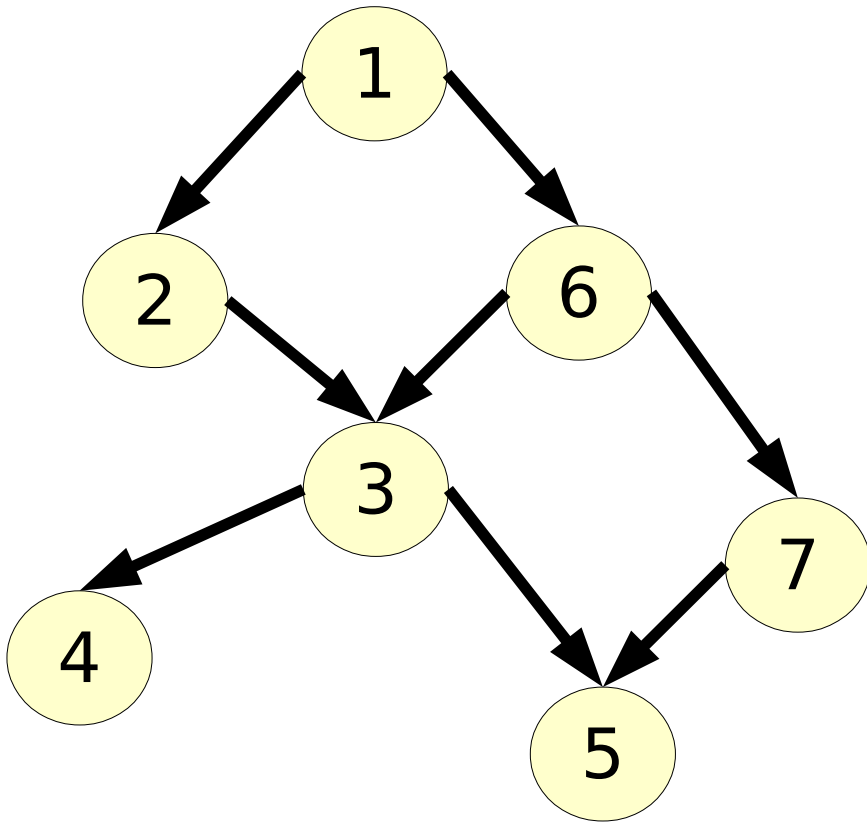
Foreach N in adjList

If open(N, G) = true

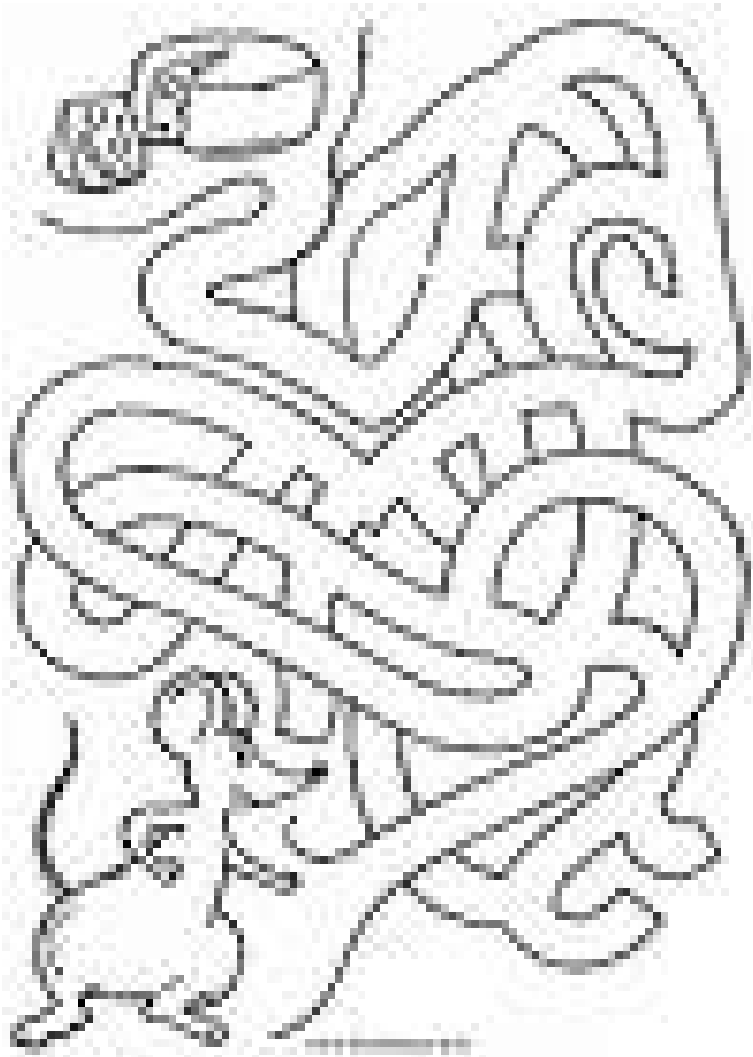
visit(N, G)

push(N, S)

Breadth vs. Depth First Search



Connected components

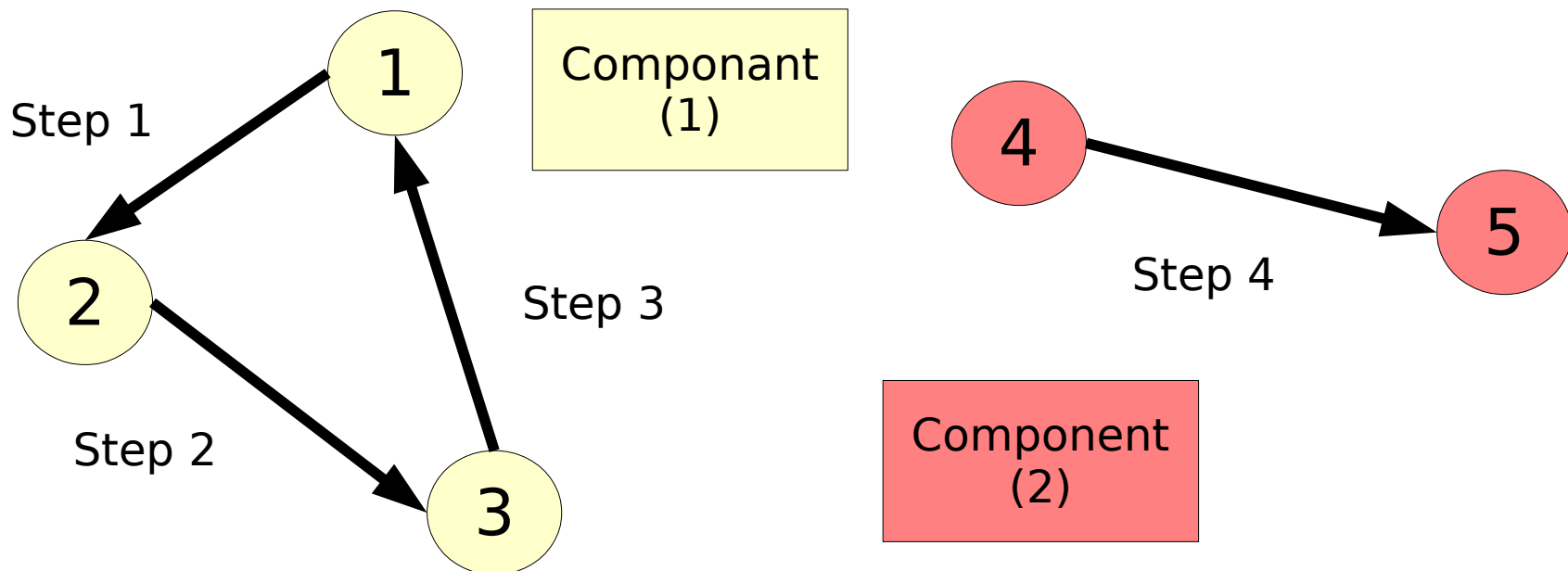


- Is there a path between i and j ?
→ i and j are in the same *connected component*
- All nodes are connected
→ *connected graph*

www.atelier-duotang.com

Connected components Principle

- 1 DFS starting at S_0
- 2 If still unvisited nodes, DFS again starting at one of these nodes



Connected components - Algorithm

Connex(Graph G)(node List)

Node N

List L \leftarrow nodes(G)

NC \leftarrow 0

Foreach N in L

 If open(N, G) = true

 NC \leftarrow NC+1

 DFS2(G, N, NC)

return L

DFS2(Graph G; Node V_0 ,
integer NC)

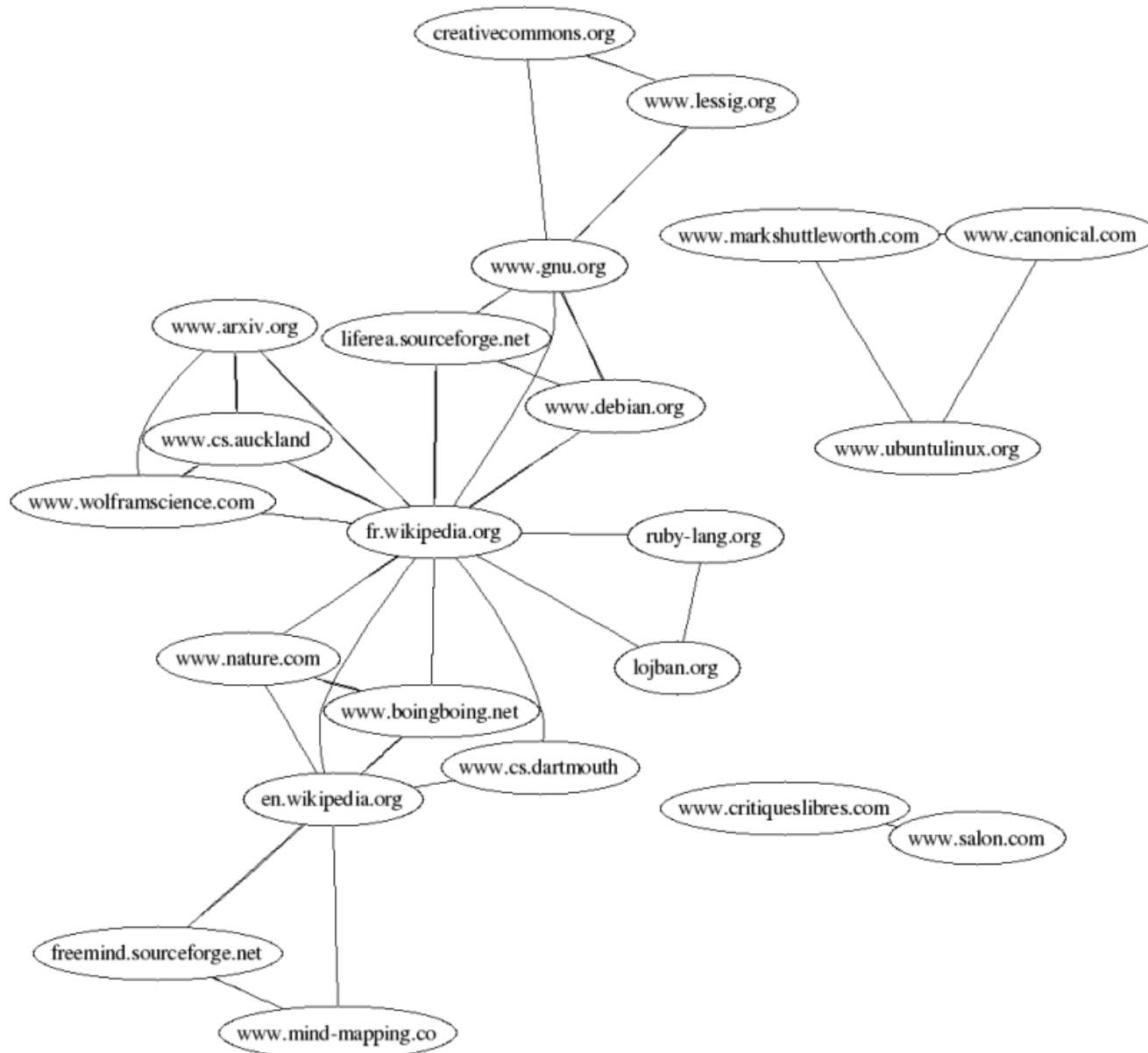
...

Visit(N, G, NC)

...

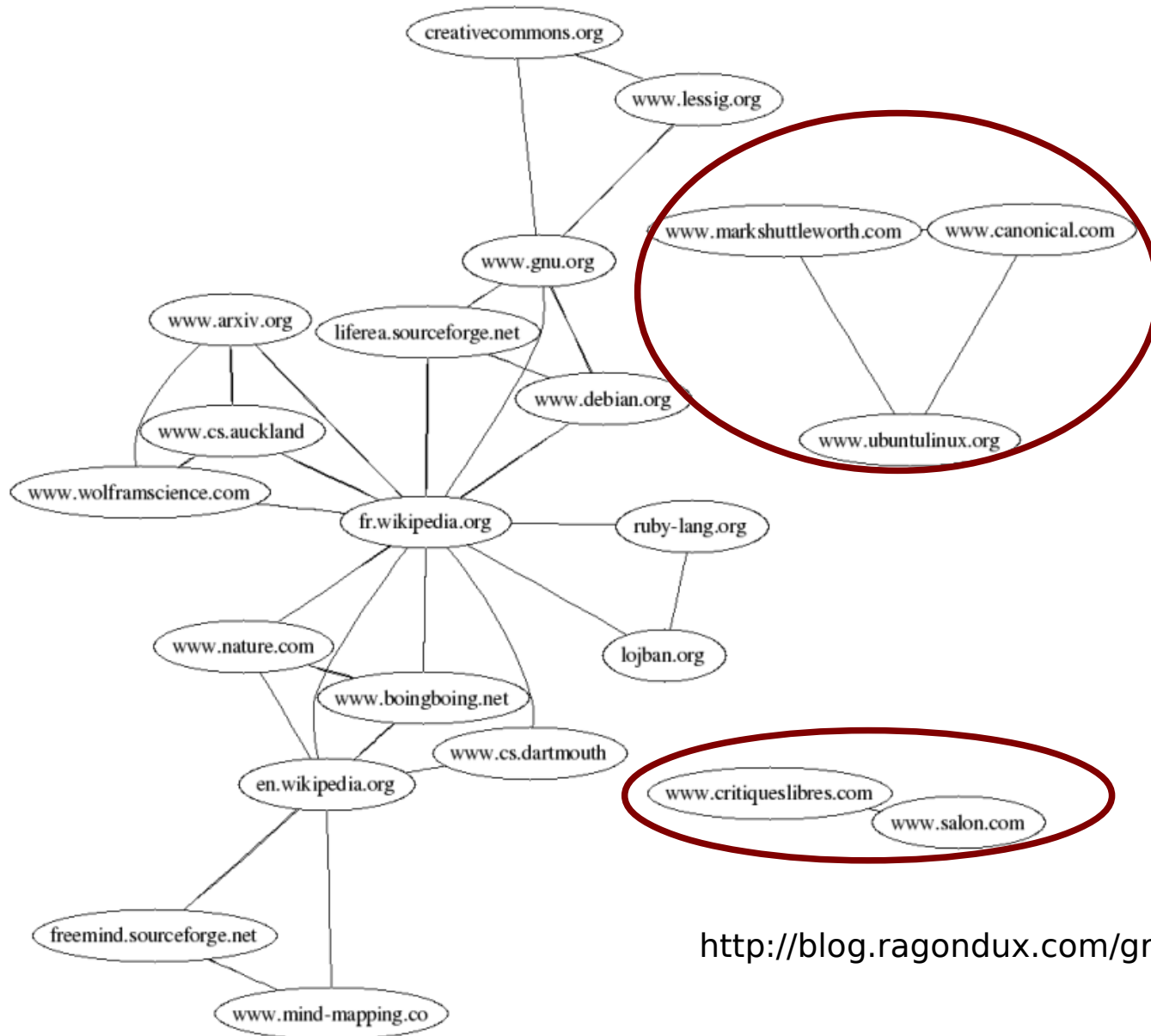
 DFS2(G, N, NC)

Exercice



Exercice

- The graph isn't connected



<http://blog.ragondux.com/graphes>

Strongly connected components

- **Strongly** connected component $C \Leftrightarrow$
 $\forall i, j \in C, \exists$ **directed** path ($i \rightarrow j$)
- \neq connected component \Leftrightarrow
 $\forall i, j \in C, \exists$ path ($i \leftrightarrow j$) (chain, undirected)
- For a given node V_0 , the associated strongly connected component is defined by :
X set s.t.
 - (1) $\forall V \in X, \text{directedPath}(V_0 \rightarrow V)$
 - (2) $\forall V \in X, \text{directedPath}(V \rightarrow V_0)$

Strongly CC - Algorithm

- Directed path search algorithms :
 - (1) \Rightarrow algorithm based on **successors**
 - (2) \Rightarrow algorithm based on **predecessors**

(1)/(2)

```
DFSSuccs(Graph G; Node  $V_0$ )
```

```
... adjacents  $\leftarrow$  DirectSuccessors( $V, G$ ) ...
```

```
StrongCC(Graph G, Node  $V_0$ )(List)
```

• Algorithm : $X_1 \leftarrow \text{DFSSuccs}(G, V_0)$

$X_2 \leftarrow \text{DFSPreds}(G, V_0)$

return $X_1 \cap X_2$

Strongly CC - Example

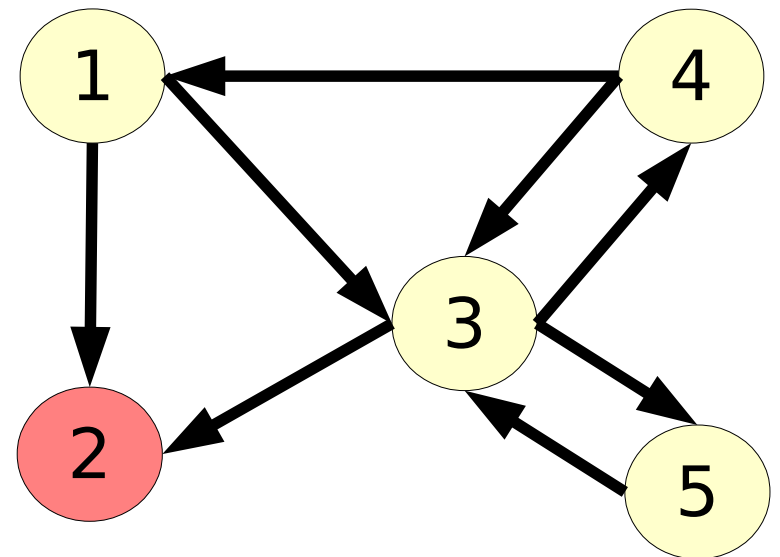
1 DFSSuccs(G, V_1)
 $\rightarrow X_1 = \{V_1, V_2, V_3, V_4, V_5\}$

2 DFSPreds(G, V_1)
 $\rightarrow X_2 = \{V_1, V_3, V_4, V_5\}$

Strongly CC

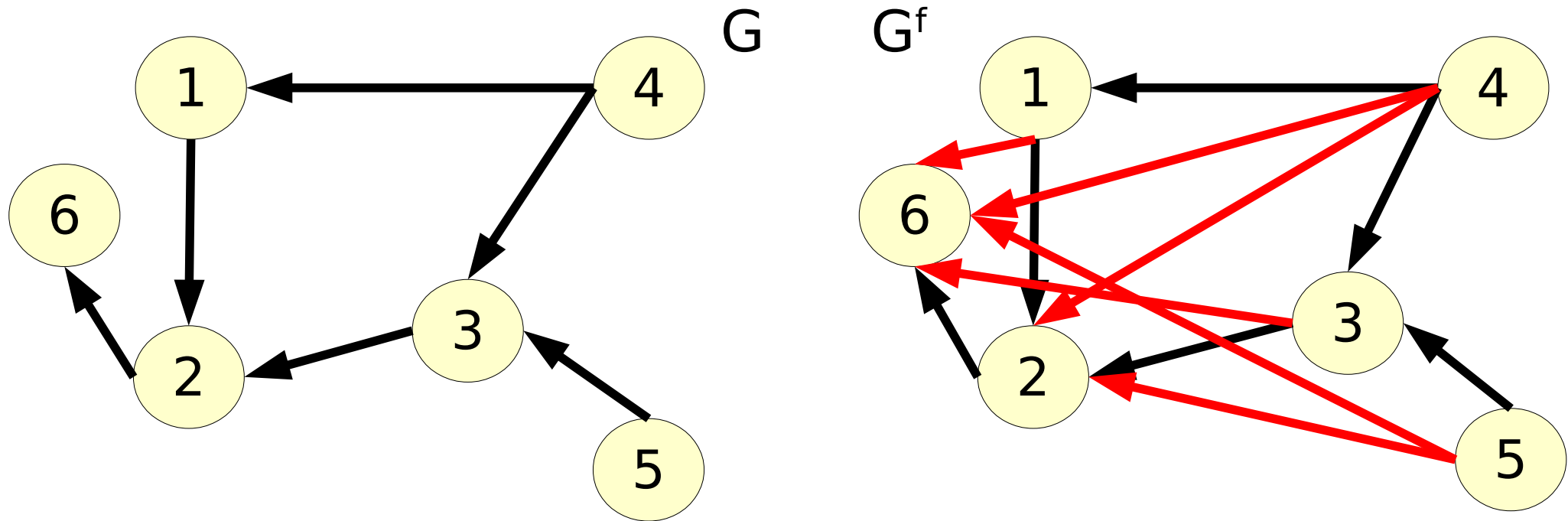
associated to V_1

$$X_1 \cap X_2 = \{V_1, V_3, V_4, V_5\}$$



Transitive closure

- For graph $G=(V, E)$, graph $G^f = (V, E')$ s.t .
 $E' = \{e'=(S_i \rightarrow S_j) \in E' \mid \exists \text{ dipath } V_i \rightarrow V_j \text{ in } G\}$



- If the graph is strongly connected, its transitive closure is a complete graph

Transitive closure

Roy-Warshall algorithm

- Idea : from $G = \{V, E\}$, add iteratively edges $V_i \rightarrow V_j$, if $V_i \rightarrow V_k$ and $V_k \rightarrow V_j$ exist
- Works with the adjacency matrix

RoyWarshall(Graph $G=(V, E)$)(graph G_f)

1- Init

$M[i, j] \leftarrow \text{true}$ *iff* edge $V_i \rightarrow V_j \in G$

2- Step

$\forall V_i \in V, \forall V_j \in V, \forall V_k \in V$

$M[i, j] \leftarrow M[i, j] \vee (M[i, k] \wedge M[k, j])$

Exercice

- Can we reach each station despite the work in progress ?

