

# REOP - Session 1

G. Dalle  
22/09/21

## I / Introduction

Guillaume DALLE [guillaume.dalle@enpc.fr](mailto:guillaume.dalle@enpc.fr)

Resources:

- Edunet page
- Teams workspace (videos)
- My website [gdalle.github.io/reop/](https://gdalle.github.io/reop/)

## II / Problems & algorithms

General framework of OR

Running example:

- Train Platforming Problem
- Inventory Routing Problem

TPP: choosing the platform for each train arriving at a railway station

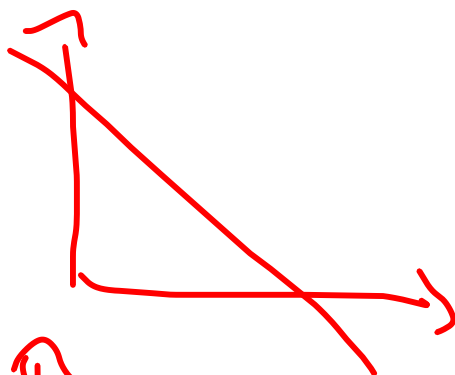
IRP: managing depot & clients, inventory (wrt supply/demand) ⊕ shipping / transportation routes


## A) Problems

Problem = family of possible inputs ⊕ question to answer about an input

- \* Decision problem: the answer is "yes" or "no"
- \* Optimization problem: find the best candidate

Quiz:  $4 \Rightarrow 1$  feasible sol  $\Leftrightarrow \inf_{x \in X} c(x) \neq \inf \emptyset$

$1 \not\Rightarrow 2$  because 

$3 \not\Rightarrow 2$  because 

$5 \not\Rightarrow 3$ : see next slide

Optimization pb :  $\min c(x)$  s.t.  $x \in X$  (P)

- "st" means "subject to"
- $x$  : decision variable
- $c$  : cost / objective function
- $X$  : set of feasible solutions
- $x \in X$  : constraints

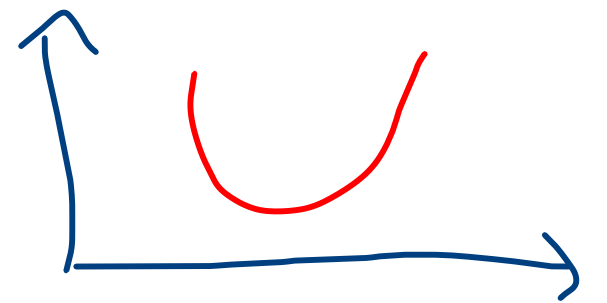
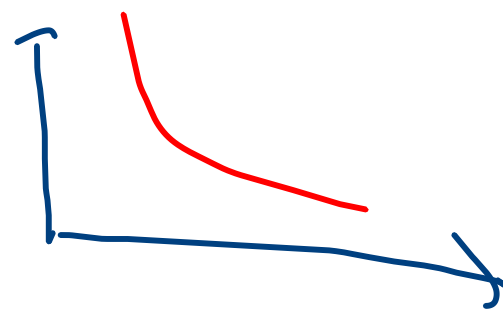
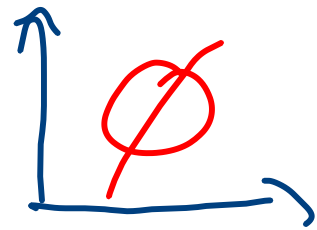
Solving the problem :

- finding its value  $\text{val}(P) = \inf \{ c(x) \mid x \in X \}$
- finding an optimal solution if it exists  $x^* \in \text{argmin} \{ c(x) : x \in X \}$

$$\text{val } P = +\infty \iff X = \emptyset$$

$\text{val } P = -\infty \iff$  we can go as low as we want

$\text{val } P > -\infty$  can mean



## B) Algorithms

Algorithm = sequence of elementary operations that can be executed by a "computer" (Turing machine)

Time complexity of  $\mathcal{A}$ : no. of elementary operations necessary for an input of (binary) size  $n$   
function  $f(n)$   $\rightarrow$  polynomial function  $\ddot{=}$  in theory  
 $\rightarrow$  exponential  $\ddot{=}$

In practice: it depends (LP)

Several types of optimization algorithms

- exact algorithms: compute an optimal solution
- approximation algs: compute a solution with bounded (near optimal) sub-optimality
- heuristics: compute a solution with no guarantee

$\hookrightarrow$  very useful in the project

How do you assess solution quality with a heuristic?  
Find (by other means) a lower bound  $l$

$$l \leq \text{val}(P) \leq c(x^{\text{heur}})$$

←————→  
how far

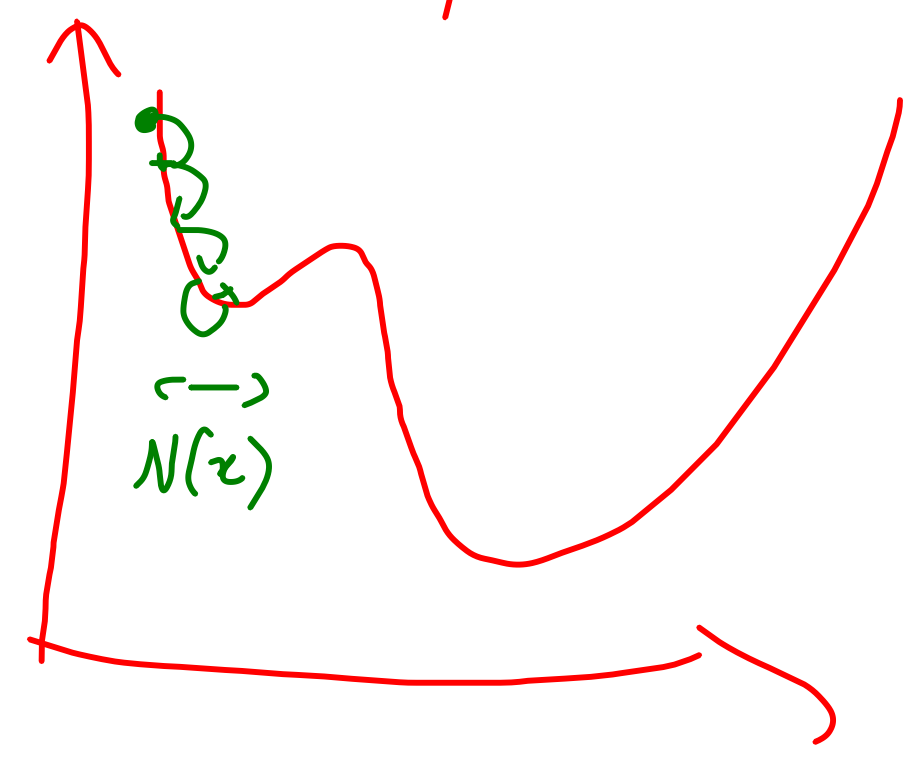
Typical example of heuristic: local search / descent  
Iterative algorithm: given a current sol  $x_k \in X$

1) Compute & explore its neighborhood  $N(x_k)$

2) Pick a next solution  $x_{k+1} \in X$  such that  $c(x_{k+1}) < c(x_k)$

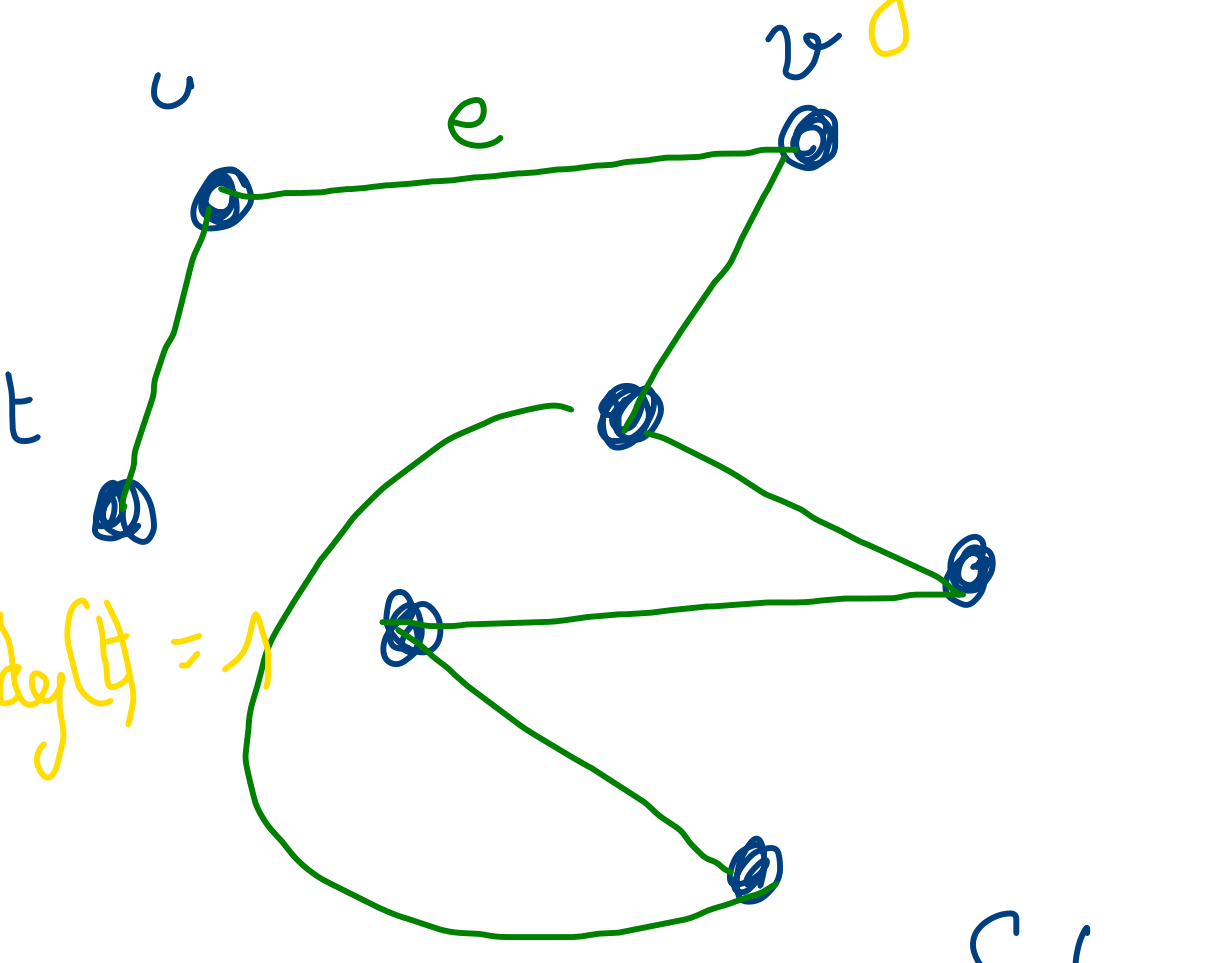
Stop when you don't improve anymore

Quiz: LD stops at a local minimum  
 Compl iterations?  $\nearrow$  size of  $N$   
 NB of iterations?



### A) Vocabulary

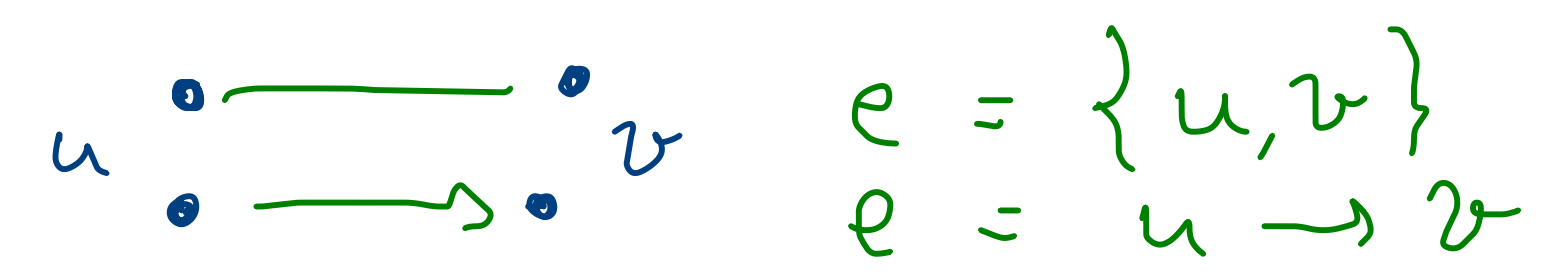
### III / Graphs



A graph  $G = (V, E)$  is a couple

- $V =$  set of vertices  $u$  or  $v$
- $E =$  set of edges  $e = (u, v) \leftarrow$

Undirected  
 Directed



Selected definitions  $\rightarrow$  see the rest in the notes

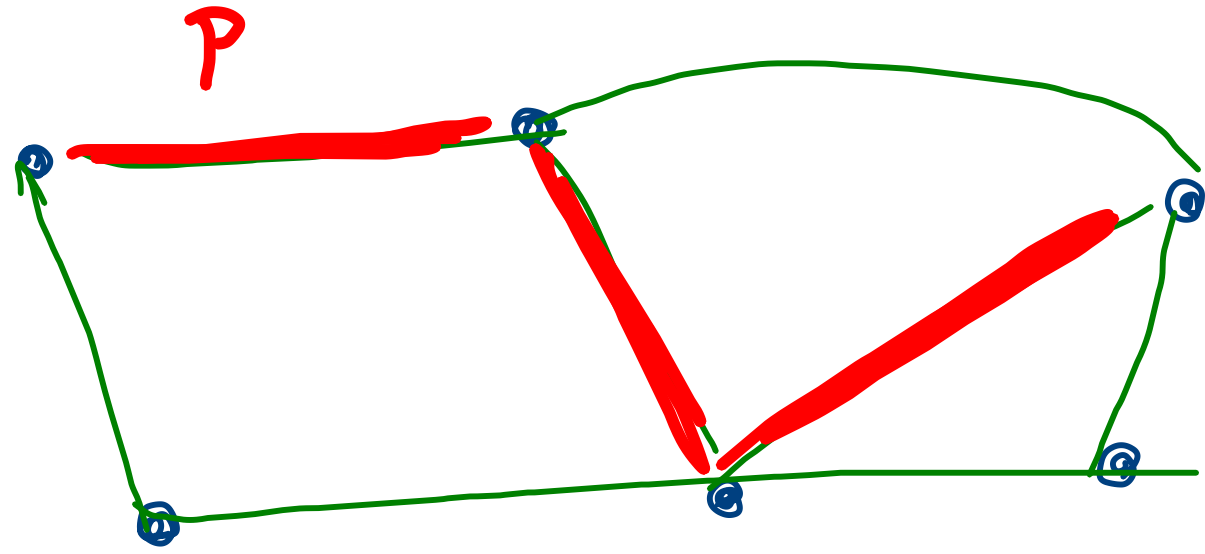
Subgraph:  $H = (V', E')$

Degree of  $v$ : nb of incident edges

$V' \subset V, E' \subset E[V'] \rightarrow$  the edges within  $V'$

## B) Paths

A path is a sequence of nodes linked of edges



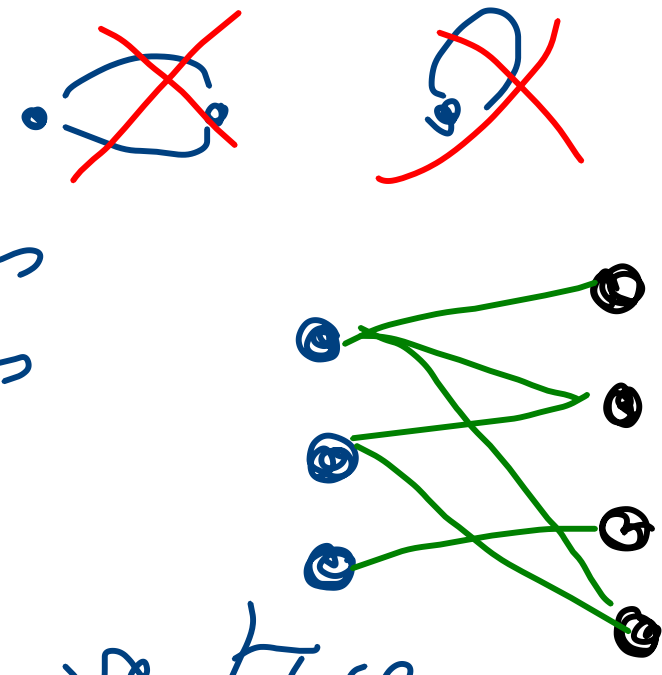
- simple: no edge is crossed twice
- elementary: no vertex is visited twice
- cycle: start vertex = end vertex
- eulerian: crosses all edges once \*
- hamiltonian: visits all vertices once

(exactly!)  
( " " )

\* Königsberg

# C) Types of graphs

- simple graph: no duplicate edges & no self-loops
- complete graph: simple graph with all possible edges
- bipartite graphs: two sets of vertices with all edges in the middle
- eulerian / hamiltonian: contain a eul. / ham. path
- connected: there is a path between all pairs of vertices

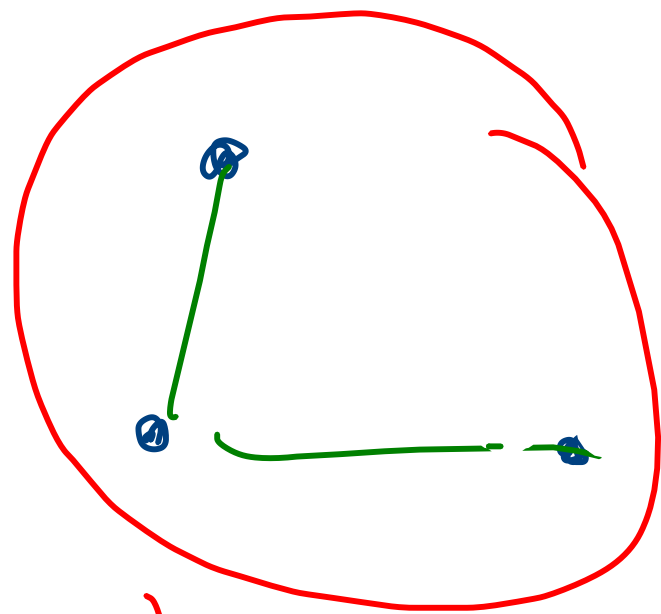


▽ for directed graphs

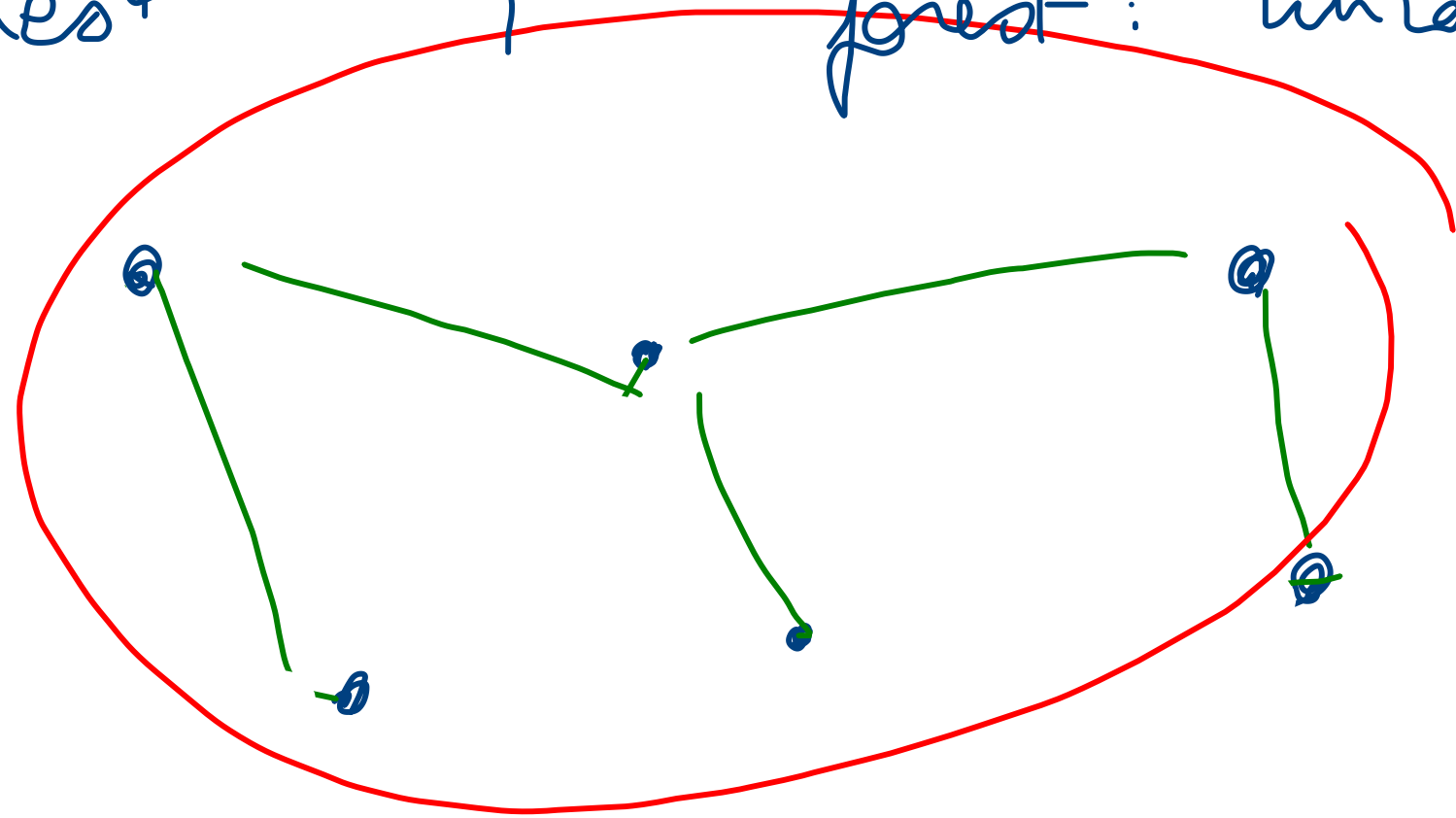


two connected component

- forest: graph with no cycle
- tree: connected with no cycle
- forest: union of trees



tree



tree  
↓  
forest



Quiz:

Elementary is simpler than simple

Complete graph with  $n$  vertices has  $m = \binom{n}{2} = \frac{n(n-1)}{2}$   
undirected

Tree has  $n-1$  edges  $\rightarrow$  exercise!

Quiz:

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

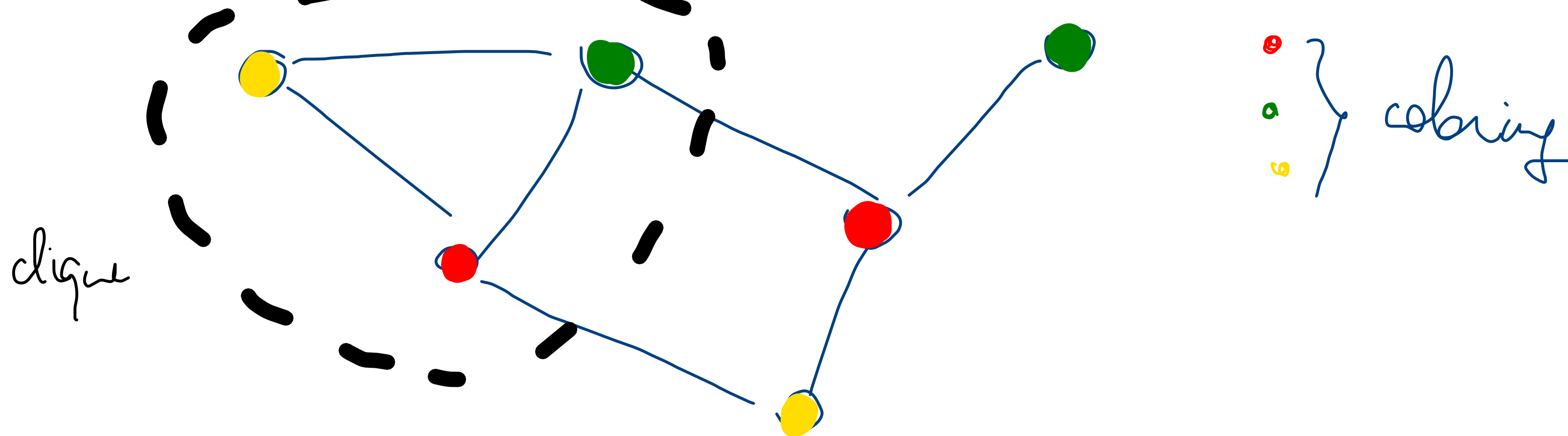
every edge is counted twice  
- for its start vertex  
- for its end vertex

$e = (u, v)$  adds 1 to degree of  $u$   
1 to degree of  $v$

# D) Zoo of graph problems

Colorings: a coloring is a function  $c: V \rightarrow \mathbb{N}$   
(one color/integer per vertex)  
such that if  $e = (u, v) \in E$ , then  $c(u) \neq c(v)$   
(no two adjacent vertices with same color)

Cliques: a clique is a complete subgraph



$\chi(G)$  = smallest number of colors needed to color  $G$  (chromatic  $\rightsquigarrow$ )  
 $\omega(G)$  = size of the largest clique (clique  $\rightsquigarrow$ )

Quiz: If  $G$  has a clique of size  $k$ , then you need at least  $k$  colors because each member of the clique needs a  $\neq$  color

So  $\chi(G) \geq \omega(G)$  but not always equal!

Look up the other animals in the zoo

- matching
- edge & vertex cover
- stable set

IV / MILP  $\rightarrow$  next time

V / Homework

- Fill the Woodpecker form if you haven't
- Exercises: 3.2, 3.3, 3.10 in the poly
- $\oplus$  if you want: finish the quiz
- Give ~~lead~~