



The class PLS

A local search problem P is in PLS if there are 3 polynomial-time algorithms A_p, B_p, C_p with :

1. Given a string $x \in \{0,1\}^*$, A_p determines if $x \in D_p$ and produces S_0
2. x , string $s \xRightarrow{B_p} C_p$ if s is sol. and Computes the cost
3. x , sol. $s \xRightarrow{C_p}$ if s local opt and if it is not C_p outputs a neighbor s' with (strictly) better cost



Theoretical results (for LS)

- Find a local optimum is – it EASY ?

Example Linear Programming

SIMPLEX . . .

Class PLS : polynomial time local search

(Johnson , Papadimitriou & Yannakakis " 88")

-find initial solution in polynomial time

-cost in polynomial time

-find better solution in the neighborhood or not existence

in polynomial Time

Examples (even for simple neighborhoods !)

(Schäffer & Yannakakis " 91 ")

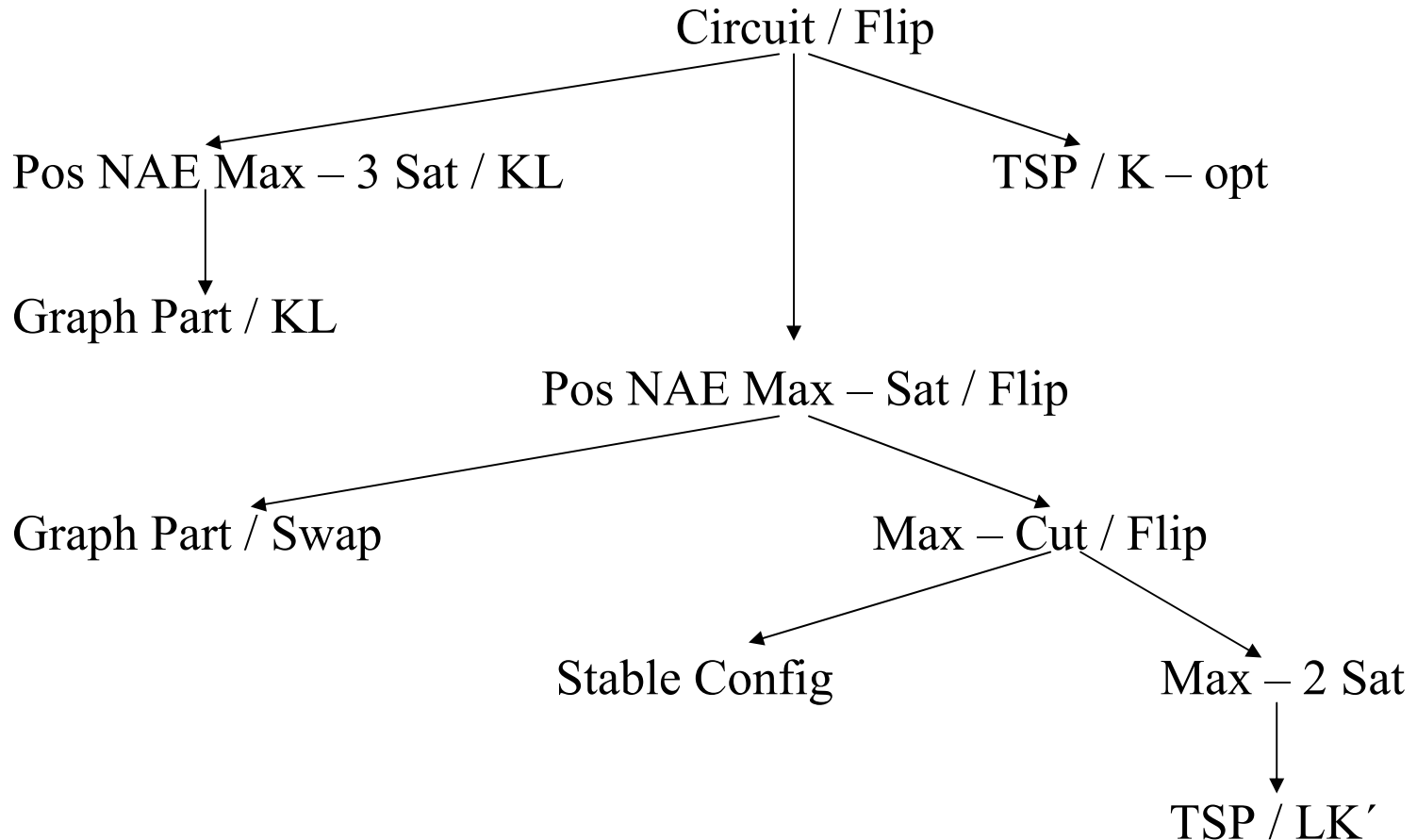
- 2 – SAT weighted
- TSP
- Bipartitioning of weighted graphs
- Max – Cut
- Stable configurations in Hopfield neural network model



PLS – complete problems

- If there exists a LS (in polynomial time) for a problem in the class then it will be the case for any other problem.
- “ For any problem in the class PLS – complete, the number of iterations with the standard local search is exponential unless $P = NP$ ”

Reductions



Which is the solutions quality of a LS ?

- for a given neighborhood
- even in exponential time !

Grover '' 92 ''

- TSP with 2 – exchange
- Bipartitioning of a weighted graph with 2 – exchange

$$C_{\text{loc}} \leq C_{AV}$$

local minimum

average cost of all solutions

Polynomial searchable Neighborhoods

- Local Search ($P \neq NP$)

- **exact solution!**
- **ϵ -approximate solution! (TSP Papad)**
- **Local optimum**

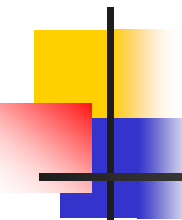
Polyn
omial

→ **Unweighted cases**
Approximation

Expo

→ **Weighted cases**

**Approximation? (PLS-
complete)**



Maximum Cut (Example with approximation 2 with $N()=SWAP$)

- Instance: $G=(V,E)$
- Solution: $V_1, V_2 \mid V_1 \cap V_2 = \emptyset, V_1 \cup V_2 = V$
- Measure: $\text{Max} |\{[u,v] \in E \mid u \in V_1, v \in V_2\}|$
- Initial solution: $V_1 = \emptyset, V_2 = V$ feasible



SWAP Neighborhood

$$N(V_1, V_2) = \{(V_{1K}, V_{2K}), K=1, \dots, |V|\}$$

$$V_{1K} = V_1 - \{v_K\}, \quad V_{2K} = V_2 \cup \{v_K\} \quad \text{if } v_K \in V_1$$

$$V_{1K} = V_1 \cup \{v_K\}, \quad V_{2K} = V_2 - \{v_K\} \quad \text{if } v_K \in V_2$$



2-approximation

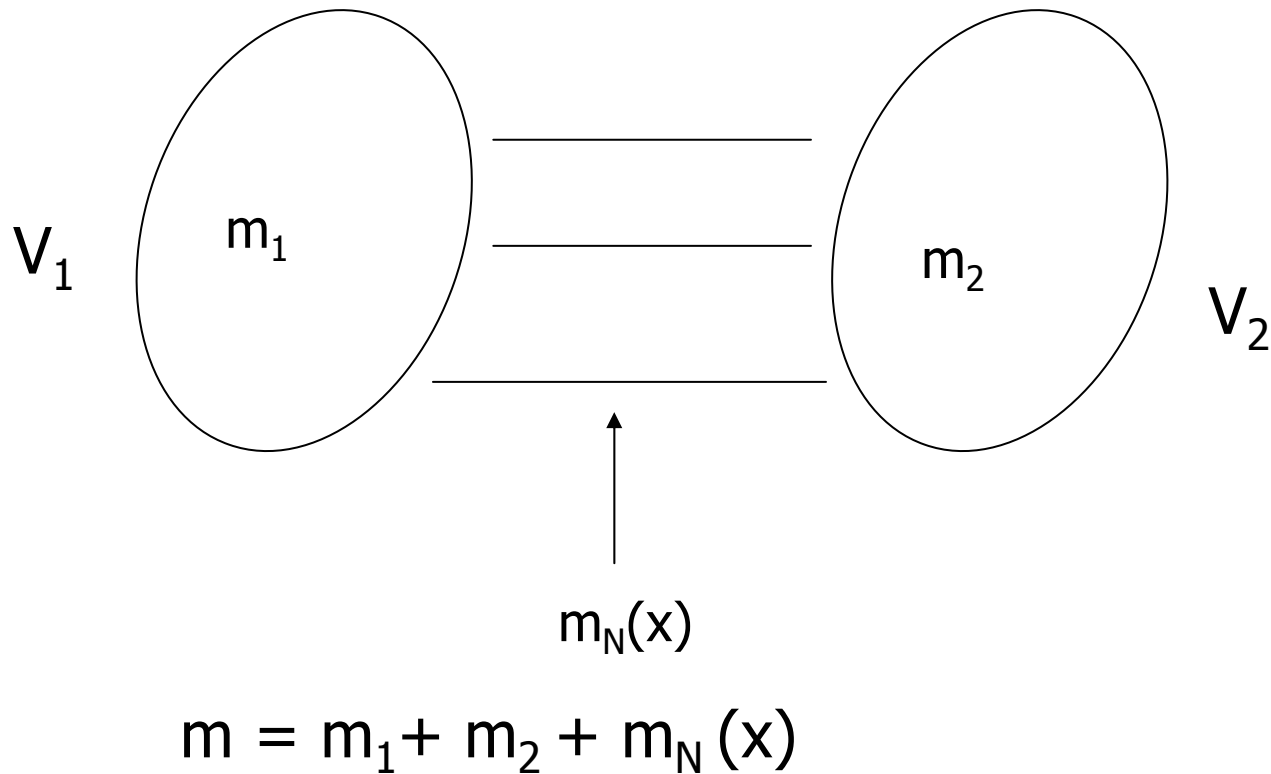
- (V_1, V_2) local optimum with N

$$\Downarrow$$
$$\frac{m^*(x)}{m_N(x)} \leq 2$$

$$\Rightarrow |E|=m \quad \Rightarrow m^*(x) \leq m$$

$$\text{if } m_N(x) \geq m/2 \Rightarrow$$

Under a local optimum





Under a local optimum

def ($\forall v_i$)

$$m_{1i} = \{v \mid v \in V_1 \text{ and } (v, v_i) \in E\}$$

$$m_{2i} = \{v \mid v \in V_2 \text{ and } (v, v_i) \in E\}$$

if (V_1, V_2) local Optimum

$$\begin{array}{ccc} \Downarrow_{\forall v_i \in V_2} & \Downarrow_{\forall v_i \in V_1} & \\ & |m_{1i}| - |m_{2i}| \leq 0 & \end{array}$$

$$|m_{2j}| - |m_{1j}| \leq 0$$



Under a local optimum

$$\sum_{\theta_i \in V_1} (|m_{1i}| - |m_{2i}|) = 2m_1 - m_N(x) \leq 0$$

$$\sum (|m_{2j}| - |m_{1j}|) = 2m_2 - m_N(x) \leq 0$$

⇓

$$m_1 + m_2 - m_N(x) \leq 0 \Rightarrow m - m_N(x) - m_N(x) \leq 0 \Rightarrow$$

$$m_N(x) \geq m/2$$



FUTURE WORK

- ?!
- Proposed bound for QAP is it attained?
- TSP with 2-OPT is it in PLS - complete?
- Other problems with guaranteed LS
- Parallelization of PBs in PLS
- " Good " neighborhood structures
- Scheduling scheme in SA