# **Mathematical Programming: Modelling and Applications**

Sonia Cafieri

LIX, École Polytechnique

cafieri@lix.polytechnique.fr

October 2009

## Mathematical formulation

#### • Sets:

V, set of vertices of GA, set of arcs of G

#### • Parameters:

 $\mu$ , are coloring of graph G k, a prefixed arc color

#### • Variables:

 $x_v$ , binary, indicates if the vertex v is contained into the densest uniformly colored subgraph (U, B):

$$\forall v \in V \quad x_v = \begin{cases} 1 & \text{if } v \in U \\ 0 & \text{otherwise} \end{cases}$$

### Mathematical model

#### • Objective function:

The densest subgraph has the maximum number of arcs and the minimum number of vertices:

$$\max\left(\sum_{(u,v)\in A} x_u x_v - \sum_{v\in V} x_v\right)$$

#### • Constraint:

There cannot be arcs in the subgraph having a color different from k:

$$\forall (u, v) \in A$$

$$x_u x_v \le \min(\max(0, \mu(u, v) - k + 1), \max(0, k - \mu(u, v) + 1))$$

ロトイプトイミトイミト 草 かくの

# Product of binary variables

Observation: we have a product of binary variables in the objective function.

Because of the product of binary variables, this formulation is nonlinear: Mixed-Integer NonLinear problem.



Use a suitable reformulation for removing the product in the objective function.

S. Cafieri (LIX) oct 2009 9 / 38

# Mathematical model: product of binary variables

#### A new variable:

 $y_{uv} \in [0, 1]$ , represents the product between  $x_u$  and  $x_v$ .

#### Objective function updated:

We substitute  $x_u x_v$  with  $y_{uv}$ :

$$\max\left(\sum_{(u,v)\in A} y_{uv} - \sum_{v\in V} x_v\right)$$

## Mathematical model: product of binary variables

#### Constraint updated:

We substitute  $x_u x_v$  with  $y_{uv}$ :

$$\forall (u, v) \in A$$
 
$$y_{uv} \leq \min\left(\max(0, \mu(u, v) - k + 1), \max(0, k - \mu(u, v) + 1)\right)$$

New Linearization Constraints:

$$\forall (u, v) \in A \quad y_{uv} \leq x_u 
\forall (u, v) \in A \quad y_{uv} \leq x_v 
\forall (u, v) \in A \quad y_{uv} \geq x_u + x_v - 1$$