

OSE SEMINAR 2013

# Reformulation of 0-1 Quadratic Programs

Otto Nissfolk

CENTER OF EXCELLENCE IN  
OPTIMIZATION AND SYSTEMS ENGINEERING  
ÅBO AKADEMI UNIVERSITY

ÅBO, NOVEMBER 15<sup>th</sup> 2013



## Table of contents

### ► Problem Formulation

- ▶ Coulomb Glass
- ▶ taixc
- ▶ Boolean Least Squares
- ▶ SDP

### ► Results

- ▶ CG
- ▶ taixc
- ▶ BLS



$$E = k \frac{1}{2} \sum_i^N \sum_{j \neq i}^N \frac{x_i x_j}{r_{ij}} + \sum_i^N \epsilon_i x_i$$

where  $r_{ij}$  is the distance between impurities  $i$  and  $j$ ,  $\epsilon_i$  is the energy for impurity  $i$  and  $x_i$  is a binary variable stating if impurity  $i$  is occupied or not. If  $n$  impurities are occupied then  $\sum_i^N x_i = n$ .

$$E = \frac{1}{2} \mathbf{x}^T \mathbf{Q} \mathbf{x} + \mathbf{c}^T \mathbf{x}$$

where element  $M_{ij} = \frac{1}{r_{ij}}$  and  $c_i = \epsilon_i$ .



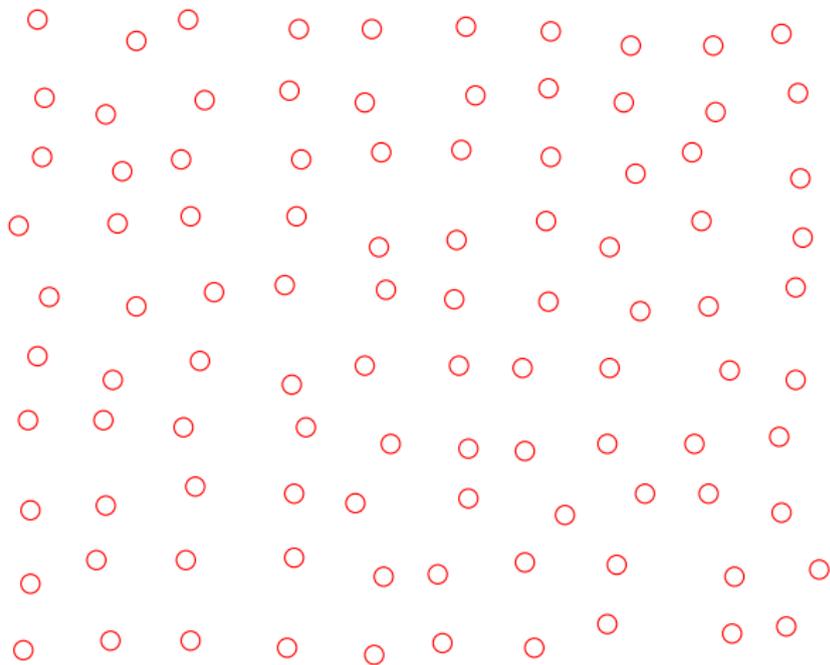
$$\min \mathbf{x}^T \mathbf{Q} \mathbf{x} + \mathbf{c}^T \mathbf{x}$$

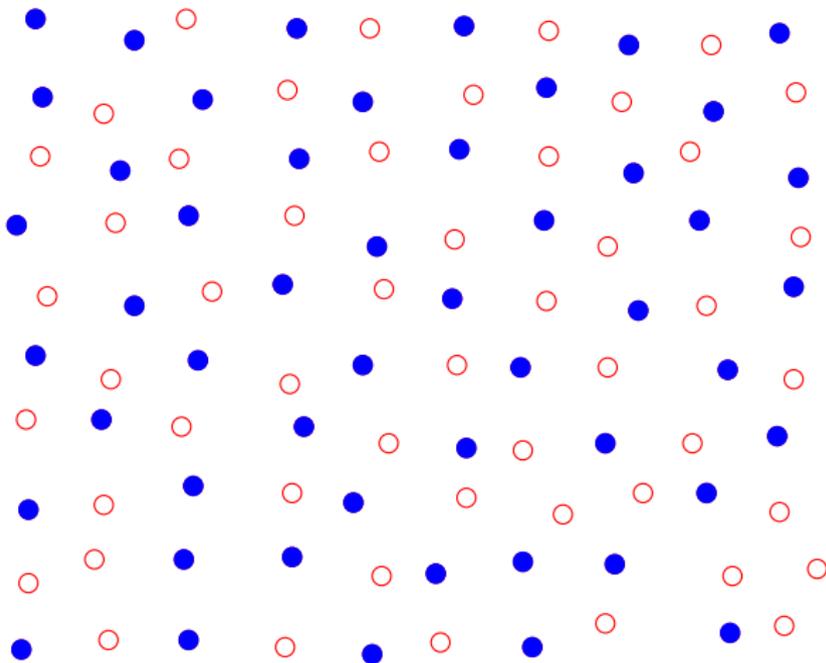
subject to

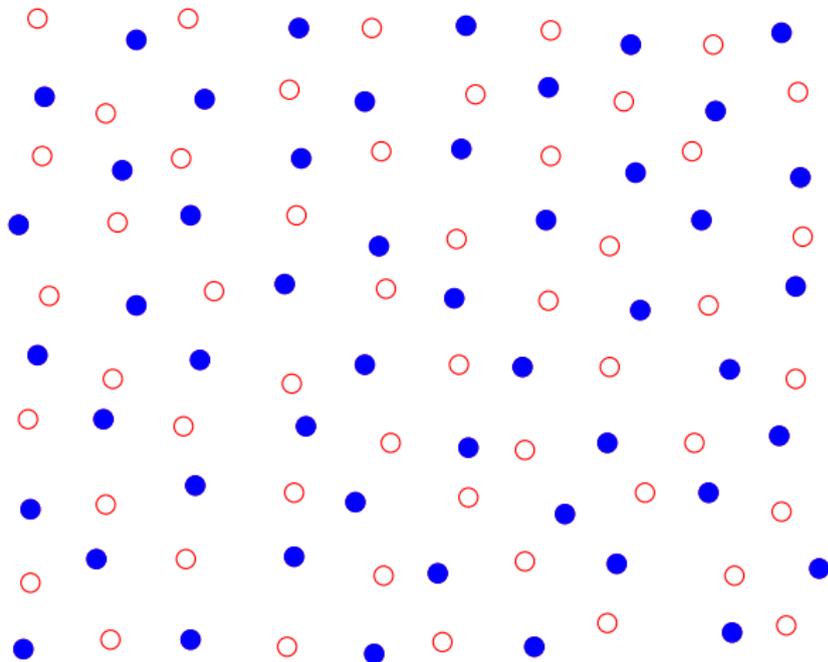
$$\sum_{i=1}^n x_i = \frac{n}{2}$$

$$x_i \in \{0, 1\}$$









$$T_{rstu} = \max_{v,w \in \{-1,0,1\}} \frac{1}{(r-t+nv)^2 + (s-u+nw)^2}$$

$$f_{ij} = \begin{cases} 1 & \text{if } i \leq m \text{ and } j \leq m \\ 0 & \text{otherwise} \end{cases}$$

$$d_{ij} = d_{n(r-1)+s, n(t-1)+u} = T_{rstu}$$

where  $(r, s)$  are the coordinates for  $i$  and  $(t, u)$  are the coordinates for  $j$



$$\min \mathbf{x}^T \mathbf{Q} \mathbf{x} + \mathbf{c}^T \mathbf{x}$$

subject to

$$\sum_{i=1}^n x_i = m$$

$$x_i \in \{0, 1\}$$



$$\min \|Ax - b\|^2$$

$$\min \mathbf{x}^T \mathbf{Q} \mathbf{x} + \mathbf{c}^T \mathbf{x} + k$$

where  $Q$  is  $A^T A$  and  $A$  is a random matrix of size  $n \times n$ ,  $c$  is  $-2A^T b$  where  $b$  is noise and  $k$  is  $b^T b$ .



$$\min \mathbf{x}^T \mathbf{Q} \mathbf{x} + \mathbf{c}^T \mathbf{x}$$

subject to

$$x_i \in \{0, 1\}$$



$$\begin{aligned} & \text{minimize} && \text{tr}(QX) + c^T x \\ & \text{subject to} && Ax = a \\ & && \text{diag}(X) = x \\ & && \begin{bmatrix} 1 & x^T \\ x & X \end{bmatrix} \succeq 0 \end{aligned}$$



$$\begin{aligned} & \text{minimize} && \text{tr}(QX) + c^T x \\ & \text{subject to} && Ax = a \\ & && \text{diag}(X) = x \\ & && \begin{bmatrix} 1 & x^T \\ x & X \end{bmatrix} \succeq 0 \\ & && x_i x_j \geq 0 && \forall i, j \\ & && x_i x_j \geq x_i + x_j - 1 && \forall i, j \\ & && x_i x_j \leq x_i && \forall i, j \\ & && x_i x_j \leq x_j && \forall i, j \end{aligned}$$



Problem	UB	LB	Gap	Time	SDP LB	SDP gap	SDP time
50	117.29	116.54	0.62%	2895.8	114.72	2.18%	0.5
100	367.75	367.45	0.08%	9468.3	363.21	1.23%	1.0
150	698.90	694.00	0.70%	14400.6	692.35	0.94%	2.0
200	1097.12	1087.62	0.87%	14400.9	1087.39	0.89%	3.1

Table : Average results for CG problems without strengthened SDP



Problem	UB	LB	Gap	Time	SDP LB	SDP gap	SDP time
50	117.29	116.54	0.62%	2895.8	114.72	2.18%	0.5
100	367.75	367.45	0.08%	9468.3	363.21	1.23%	1.0
150	698.90	694.00	0.70%	14400.6	692.35	0.94%	2.0
200	1097.12	1087.62	0.87%	14400.9	1087.39	0.89%	3.1

Table : Average results for CG problems without strengthened SDP

Problem	UB	LB	Gap	Time	SDP LB	SDP gap	SDP time
50	117.29	117.29	0.00%	2.9	117.27	0.02%	8.1
100	367.75	367.75	0.00%	26.5	367.69	0.02%	8.5
150	698.66	698.66	0.00%	170.8	698.53	0.02%	10.0
200	1096.68	1096.68	0.00%	4621.8	1096.44	0.02%	14.2

Table : Average results for CG problems with strengthened SDP



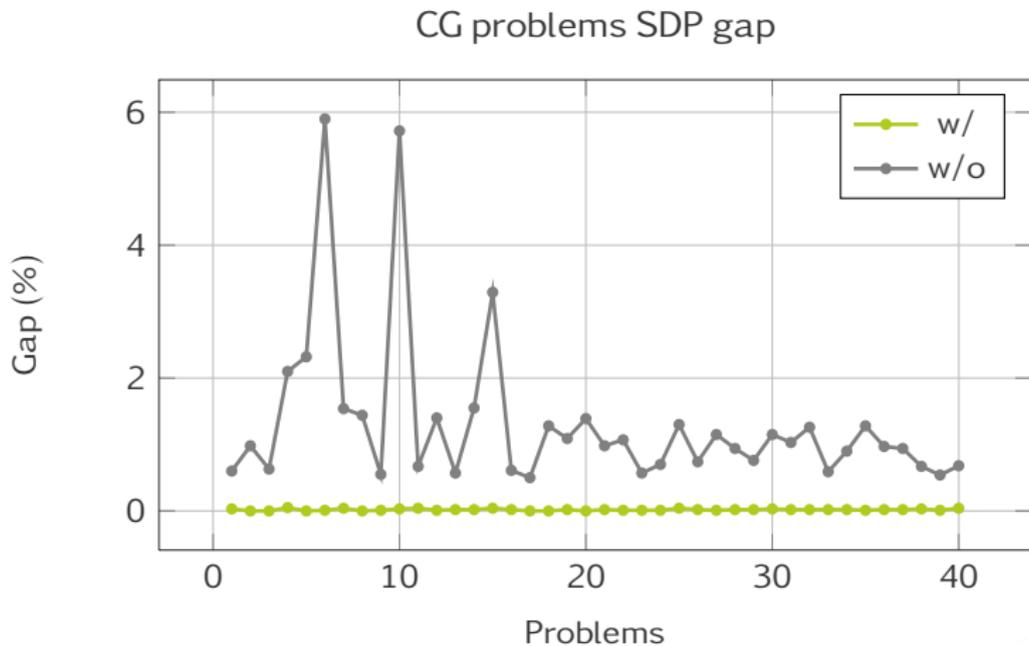


Figure : CG gap



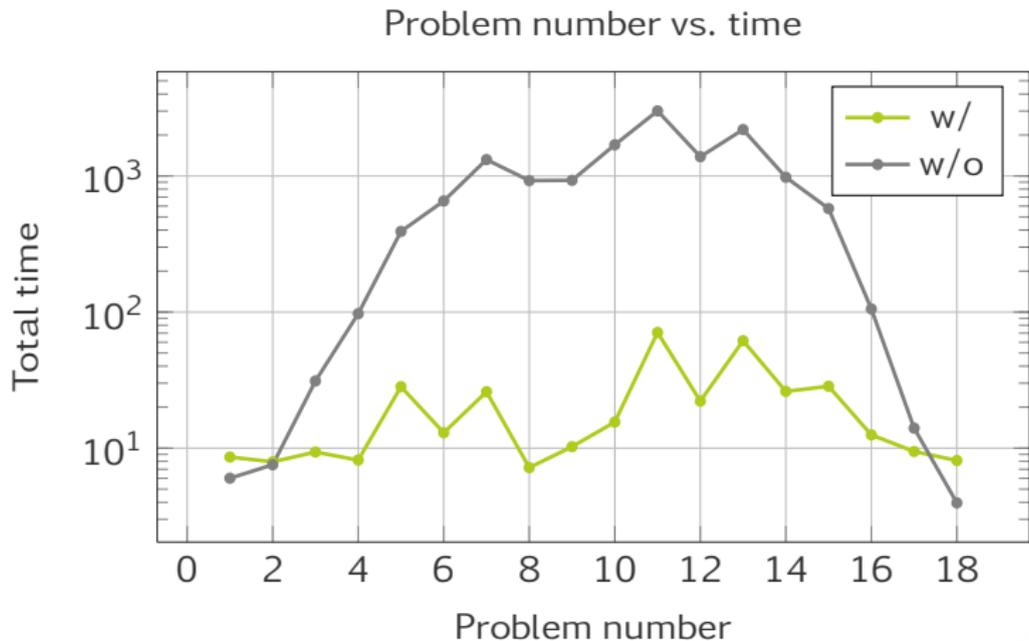


Figure : Solution times for tai36c



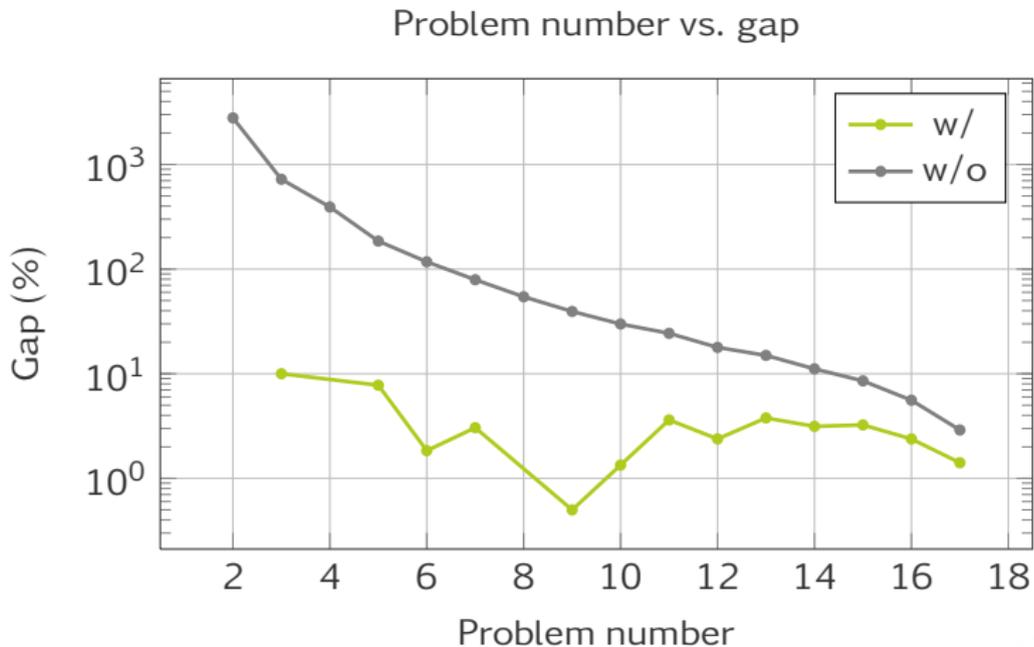
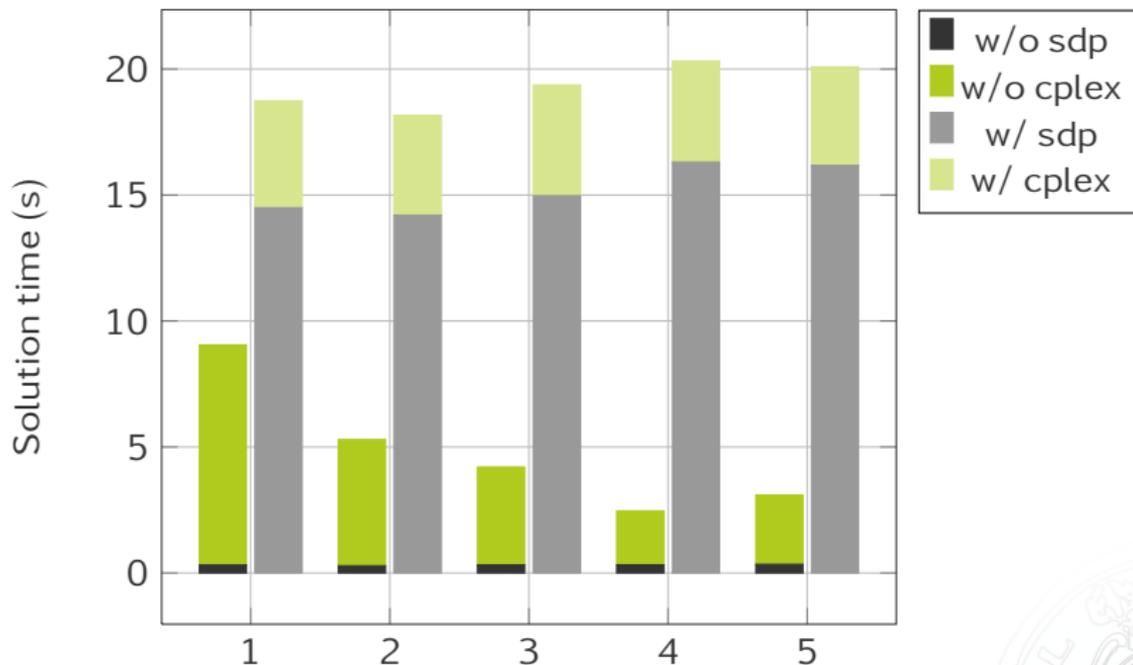


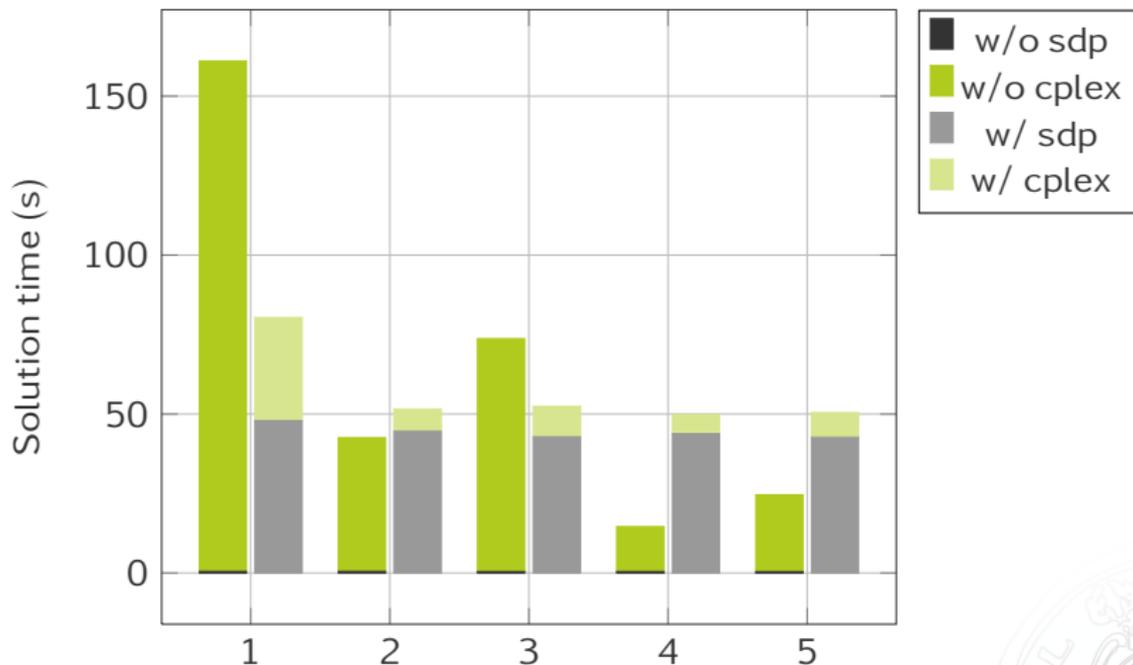
Figure : Gap for tai36c



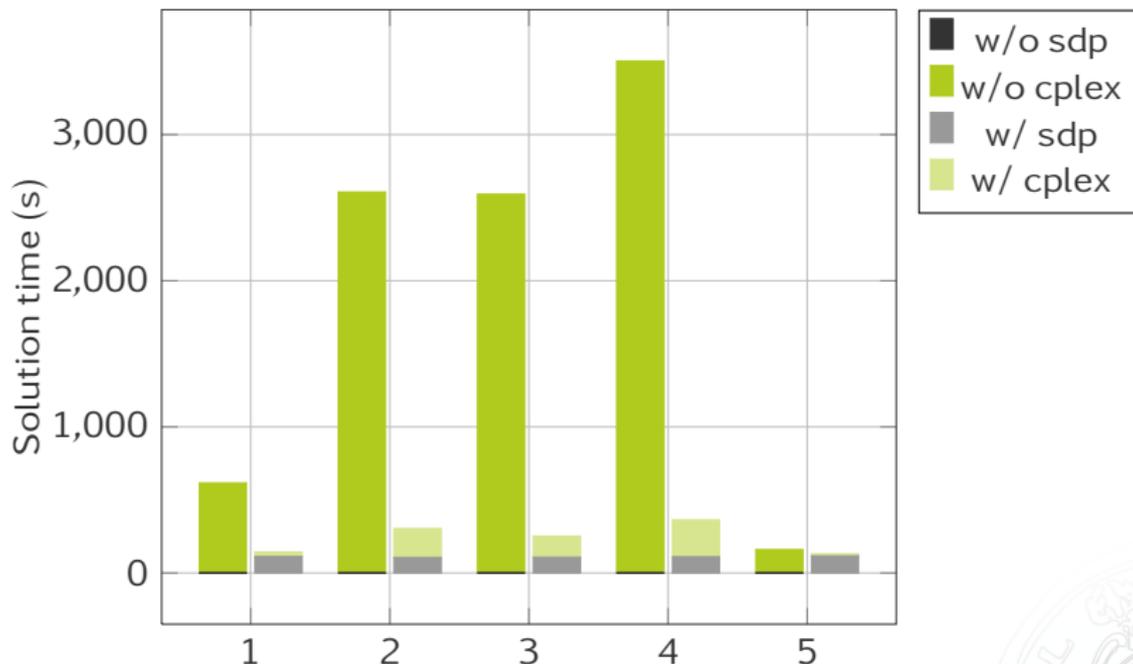
## CPLEX and SDP time for some BLS problems of size 40



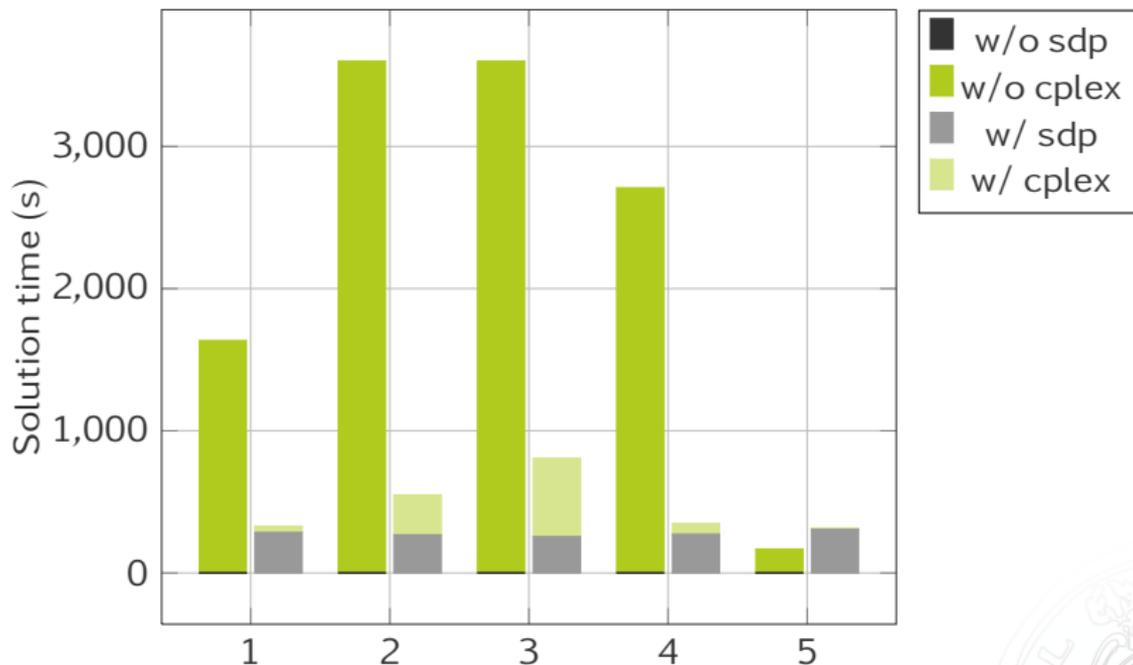
## CPLEX and SDP time for some BLS problems of size 60



## CPLEX and SDP time for some BLS problems of size 80



## CPLEX and SDP time for some BLS problems of size 100



## Some references



Alain Billionnet, Sourour Elloumi, and Marie-Christine Plateau.

Improving the performance of standard solvers for quadratic 0-1 programs by a tight convex reformulation: The qcr method.

*Discrete Appl. Math.*, 157:1185–1197, March 2009.



R.E. Burkard, E. Cella, P.M. Pardalos, and L.S. Pitsoulis.

*Handbook of Combinatorial Optimization*, volume 3.  
1998.



C. S. Edwards.

A branch and bound algorithm for the koopmans-beckmann quadratic assignment problem.

*Combinatorial Optimization II*, 13:35–52, 1980.



Tjalling C. Koopmans and Martin Beckmann.

Assignment problems and the location of economic activities.

*Econometrica*, 25(1):pp. 53–76, 1957.



É.D. Taillard.

Comparison of iterative searches for the quadratic assignment problem.

*Location Science*, 3(2):87 – 105, 1995.



Thank you for listening!

Questions?

