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# Assignment Problems in Cost Function Networks

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We develop an **AllDifferent** constraint propagator for solving assignment problems in Cost Function Networks. Our propagator interacts with external unary cost functions (linear objective) and is able to **reformulate the problem** with an explicit lower bound in minimization. When applied at every search node of branch-and-bound method, it provides competitive results to standard constraint and integer programming approaches on difficult **Quadratic Assignment Problems** and selected **XCSP3 Competition** benchmarks.

## Weighted Constraint Satisfaction Problem

Definition: graphical model, aka. Cost Function Network

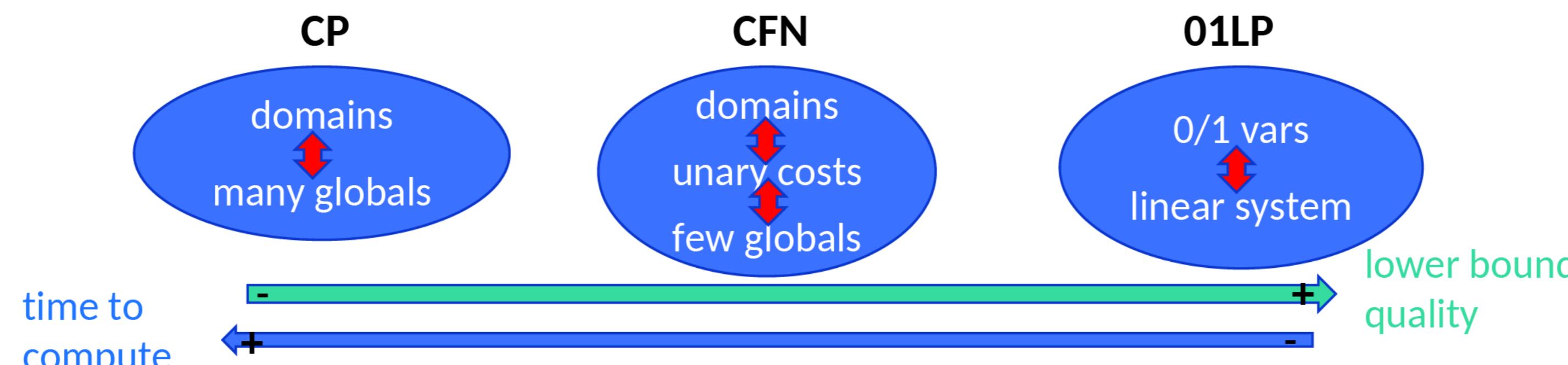
- ▶ A set  $X$  of discrete variables
- ▶ A set  $D$  of finite domains
- ▶ A set  $F$  of potential functions or cost functions
- ▶ For each function  $f_S : \prod_{x \in S} D_x \rightarrow \text{Nor} \mathbb{R} \cup \{\infty\}$

### Objective:

Find a complete assignment  $x$  minimizing  $F(x) = \sum_{S \in F} f_S(x|_S)$   
where  $x$  is a complete assignment of  $X$  and  $x|_S$  denotes the projection of  $x$  to variables  $S$ .

### NP-Hard Problem

(Cooper 2010)



## Example

$x \ y \ f_{xy}$		
a	a	3
a	b	2
b	a	0
b	b	$\infty$

$x \ f_x$		
a	0	
b	2	

$y \ f_y$		
a	0	
b	2	

$\min_{x,y} f_x(x) + f_y(y) + f_{xy}(x,y)$

$x = b, y = a$  is the optimal assignment with cost 2.

## Constraint Programming

Google Or-tools CP-SAT solver

MinWeightAllDifferent( Workers,  $f$ ,  $ub$  )

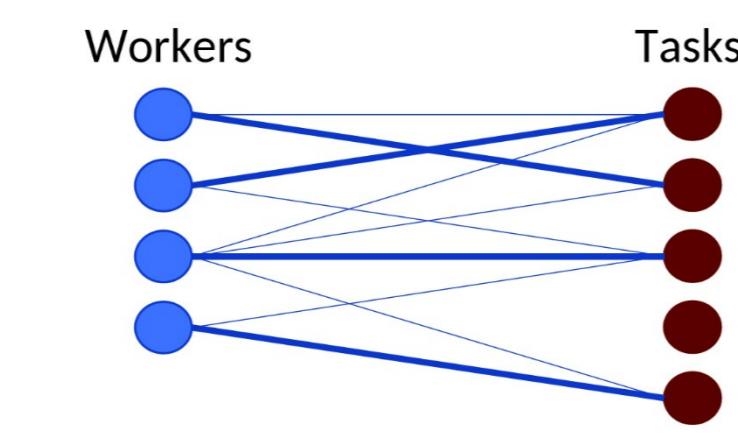
$\equiv$  AllDifferent(  $\{X_i, X_j, X_k, X_l\}$  )  $\wedge \sum f_i(X_i) < ub$

(Régis 1994)

**Main drawbacks**

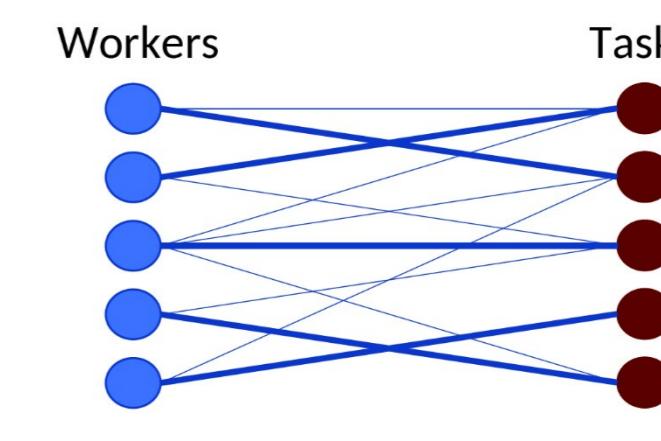
- Communication between constraints only through domains
- Incremental issue during search (unary costs are always the same)

## AllDifferent – non-permutation case ( $|X| < |D|$ )



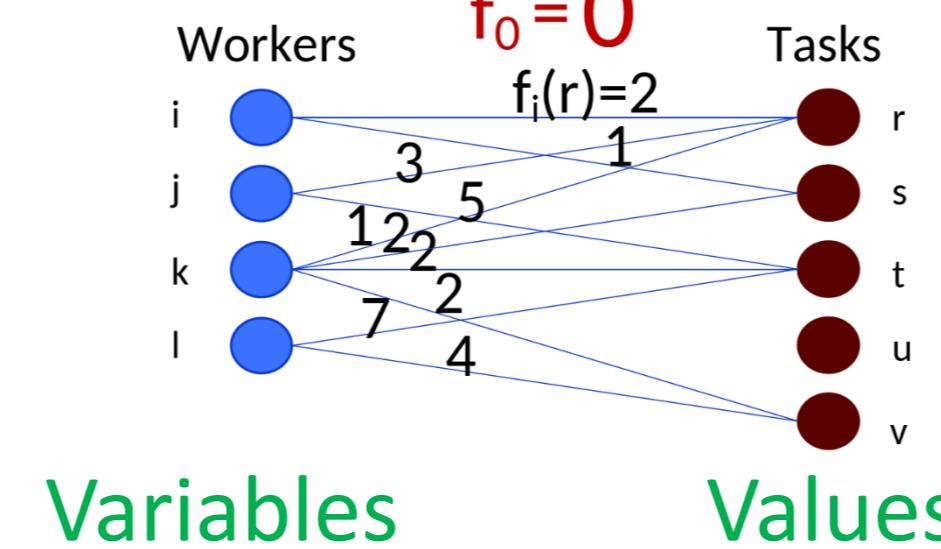
## AllDifferent – permutation case ( $|X| = |D|$ )

(Burkard, Dell'Amico, Martello 2012)

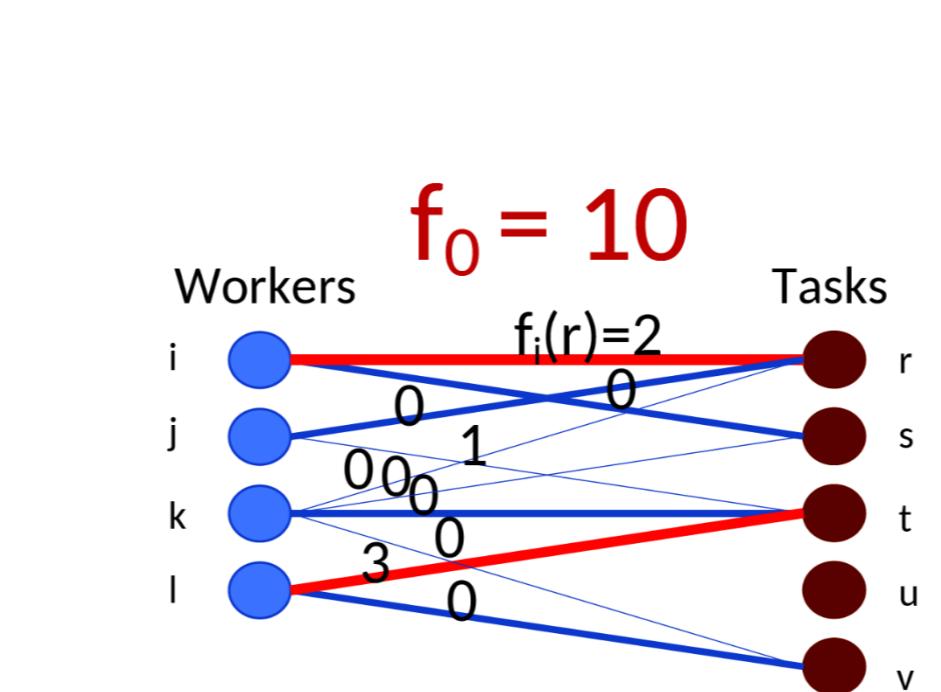


## Cost Function Network

AllDifferent( Workers ) +  $\sum f_i(X_i) + f_0 < ub$



Node Consistency (Larrosa 2002)



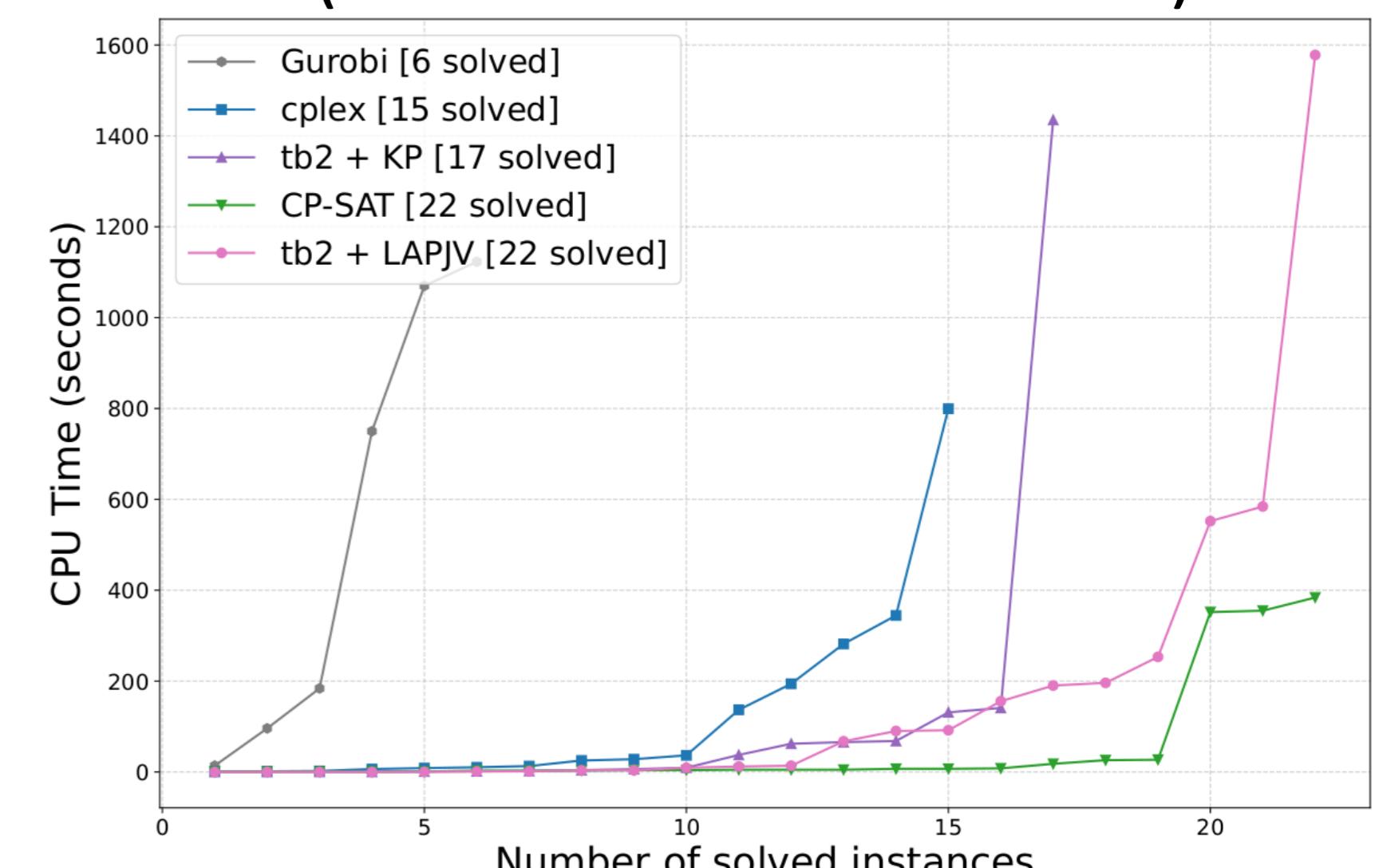
NC (ub=12)

Better domain filtering rule :  
 $\forall i, r, f_i(r) + f_0 < ub$

Better lower bound  $f_0$

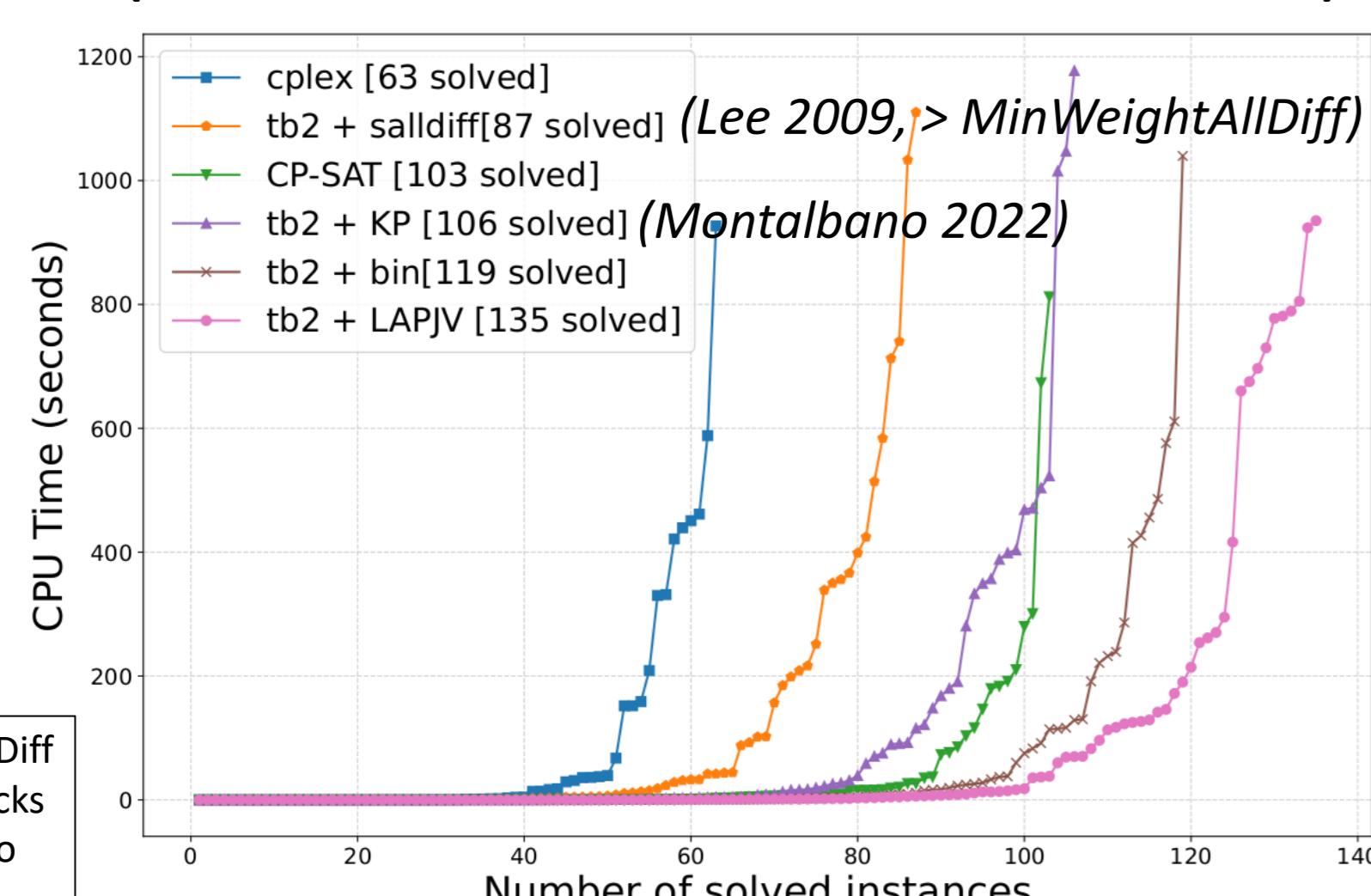
## XCSP 2024 Mini COP

(40 instances with AllDiff)



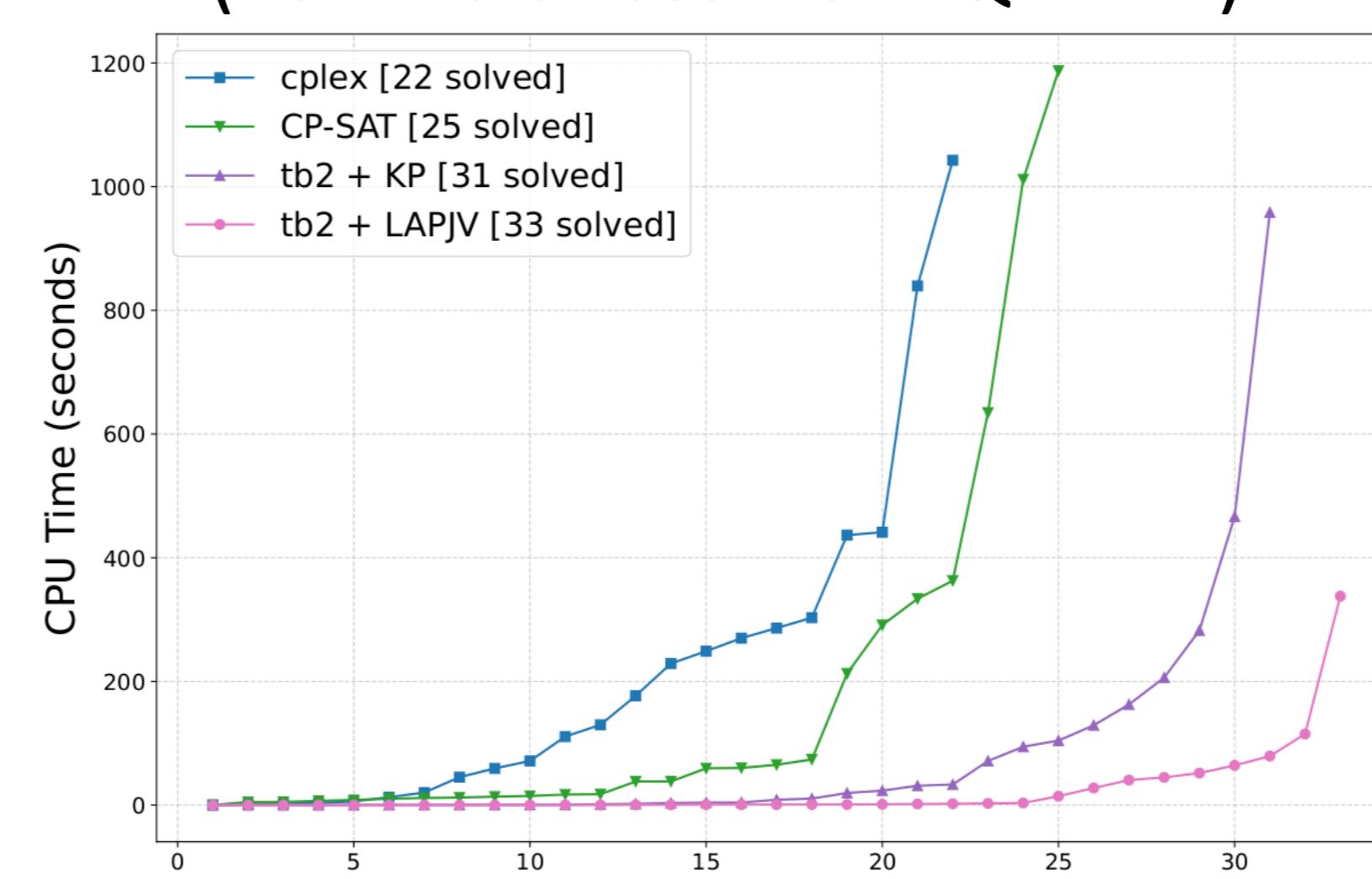
## Computational results

Weighted N-Queen Problem  
(140 instances from  $n=4$  to  $n=30$ )



Solver	IBM	tb2	OR-tools	tb2	tb2	tb2
$N$	cplex	salldiff	CP-SAT	KP	binary	LAPJV
Score	63.5	90.0	105.5	109.5	126.5	138.0

Quadratic Assignment Problem  
(132 instances from QAPLIB)



Solver	cplex	CP-SAT	tb2+at-least-one	tb2+LAPJV
Score	25	43.5	57.5	100
gap	16% (107)	5.4% (121)	5.3% (131)	3.9% (131)

Solver	gurobi	cplex	tb2+KP	CP-SAT	tb2+LAPJV
Score	6	15	17	23.5	24.5

<https://github.com/toulbar2/toulbar2>  
pip install pytoulbar2