

Integrazione di tecniche di
ricerca operativa e constraint
programming per
ottimizzazione multiobiettivo

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Constraint Optimization Problem

- A COP a CSP (X,D,C) with a cost function f to minimize

$$f: D_1 \times \dots \times D_N \rightarrow S_t$$

where (S_t, \leq) is a total order

- An assignment A is an optimal solution to a COP iff it is a solution of the CSP and $\neg \exists A'$ s.t. $f(A') < f(A)$
- Total order among solutions:
 - Only the *best* assignment satisfying constraints is considered solution of the COP

Multi-criteria Optimization Problems

- A MOP is a CSP (X,D,C) with functions $f \equiv f_1, f_2, \dots, f_n$, that “*should be optimized at the same time*”
- The user *is not able* to synthesize the functions into only one
 - usually, *tradeoff* solutions are considered more interesting, *extreme* solutions are seldom accepted
- In most cases there is not only *one* optimal point

Non-Dominated Frontier

- In a MOP, the concept of *better solution* turns into the concept of *Domination*:

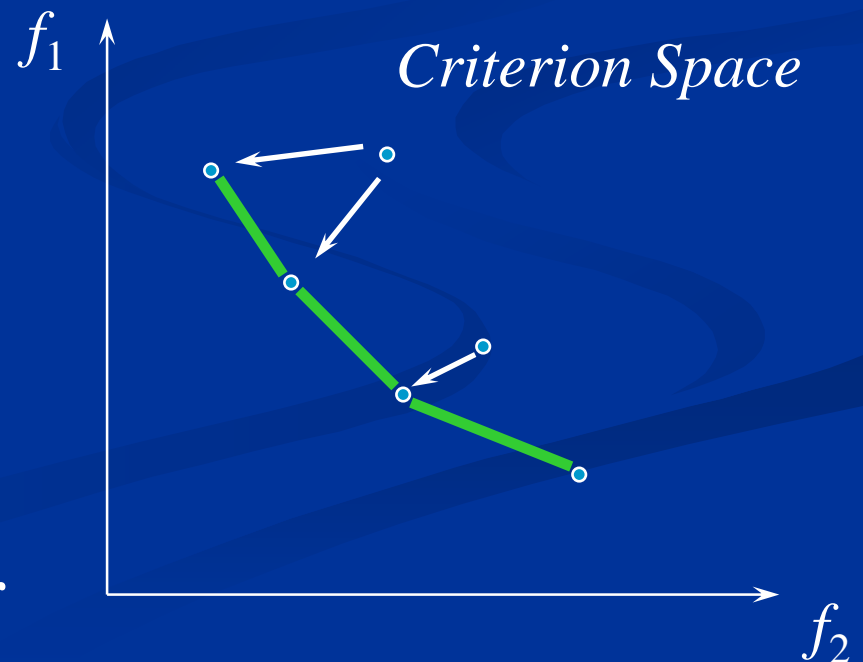
$$\underline{X} \leq_d \underline{Y} \Leftrightarrow \forall k=1..n, X_k \leq Y_k$$

- A Solution of the CSP is

Pareto-Optimal or *Non-Dominated* iff

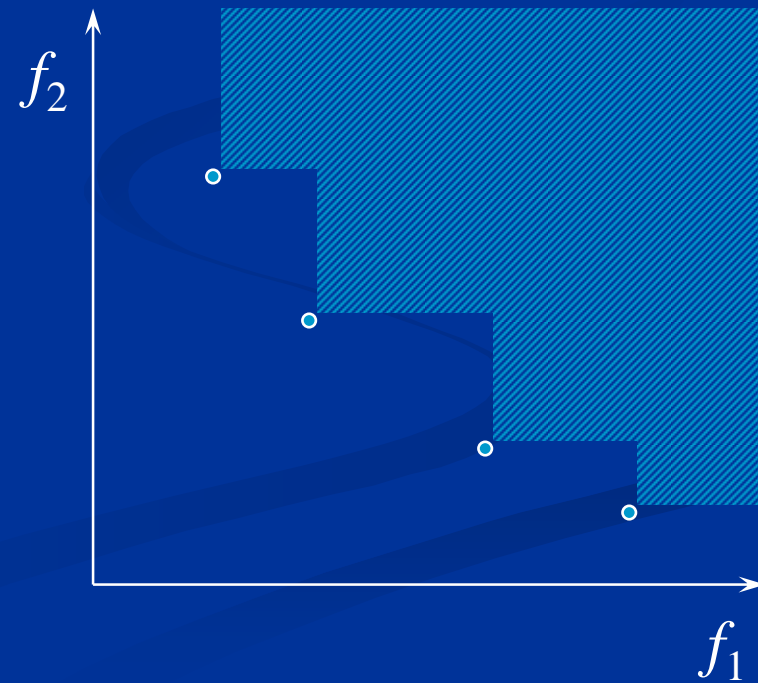
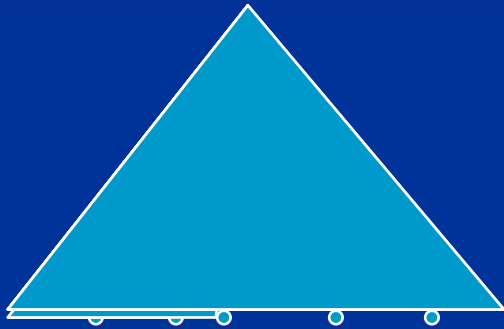
$$\neg \exists A' \text{ s.t. } \underline{f}(A') <_d \underline{f}(A)$$

- Only points in the nondominated frontier are interesting to the user

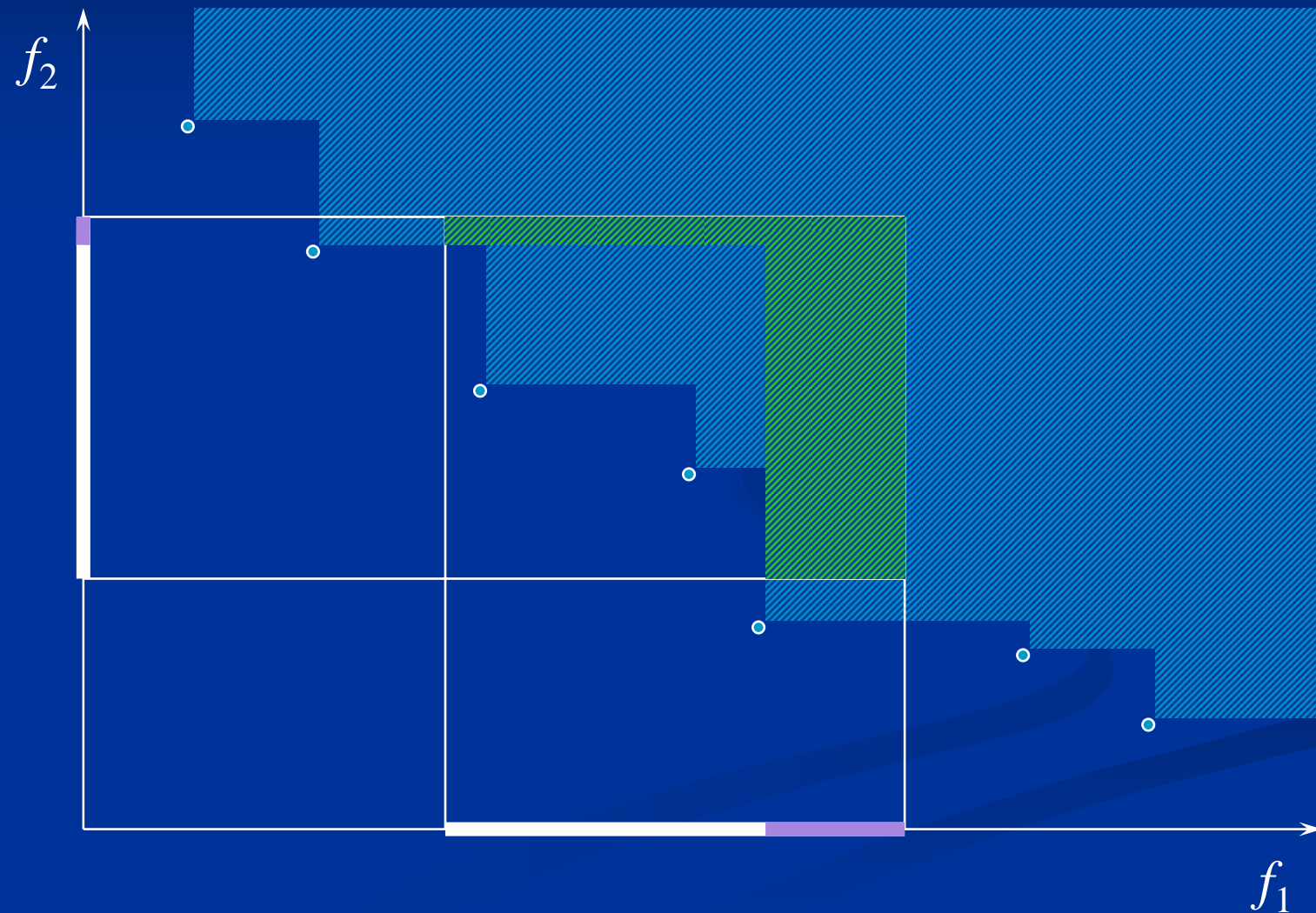


PCOP-B&B

Search Tree



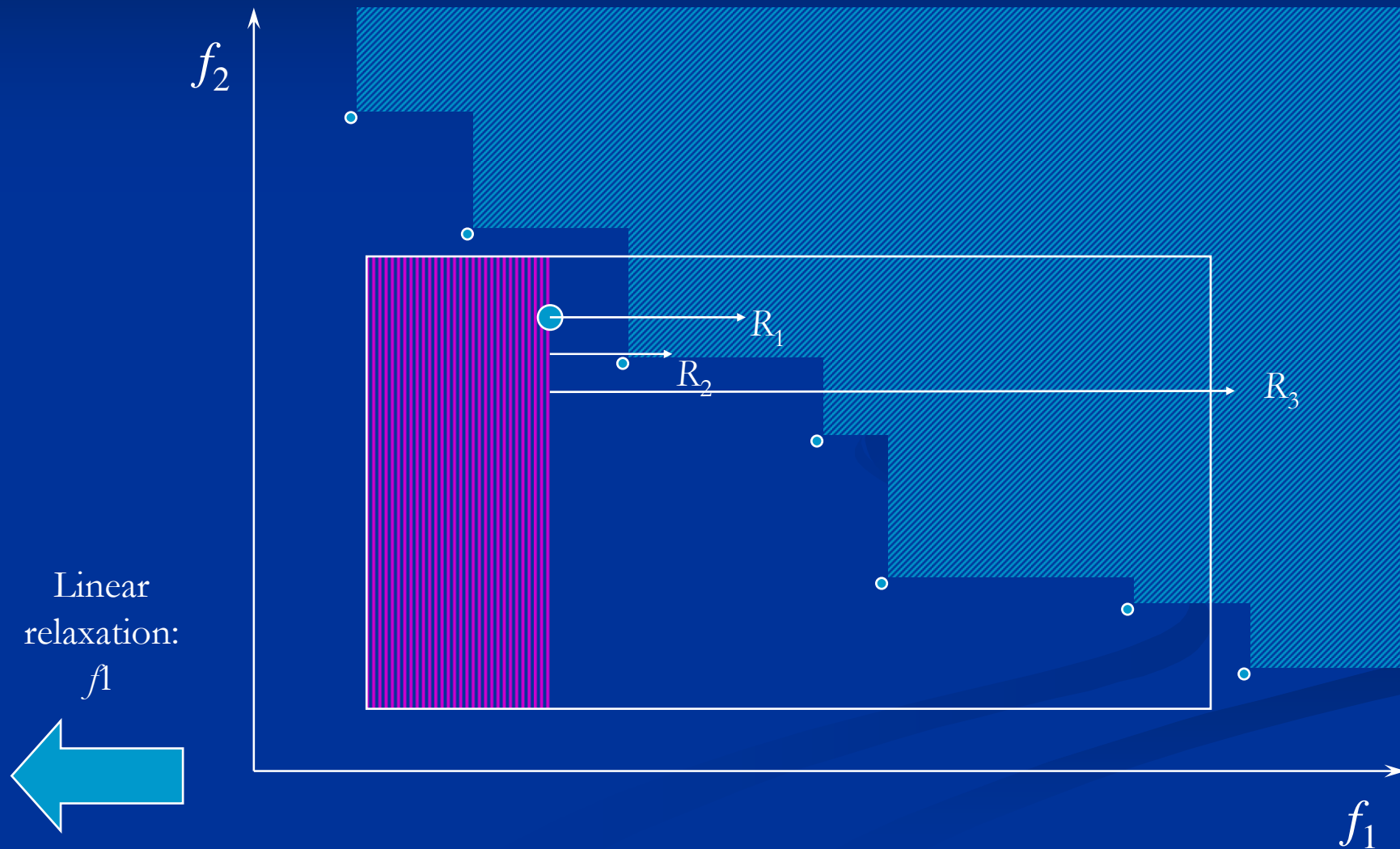
Propagation of unbacktrackable constraints



Integration with OR

- Linear relaxation of the problem
 - provides a better bound on the objective function value (e.g., function f_1)
 - provides reduced costs
 - for variable X_i , the reduced cost R_i gives
 - how much the objective function will worsen, if we add 1 unit of variable X_i in solution*

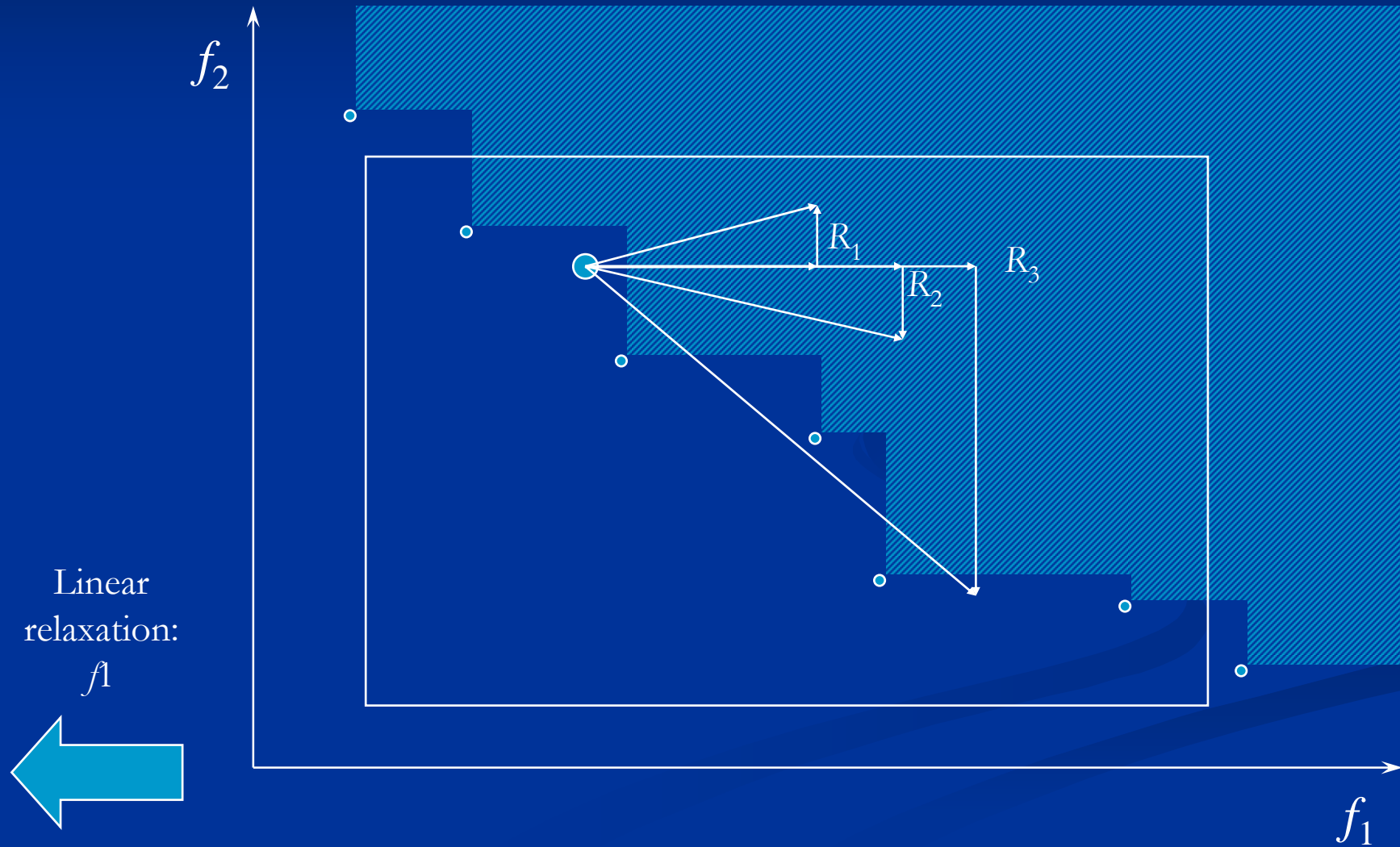
Classic Propagation of bounds & reduced costs



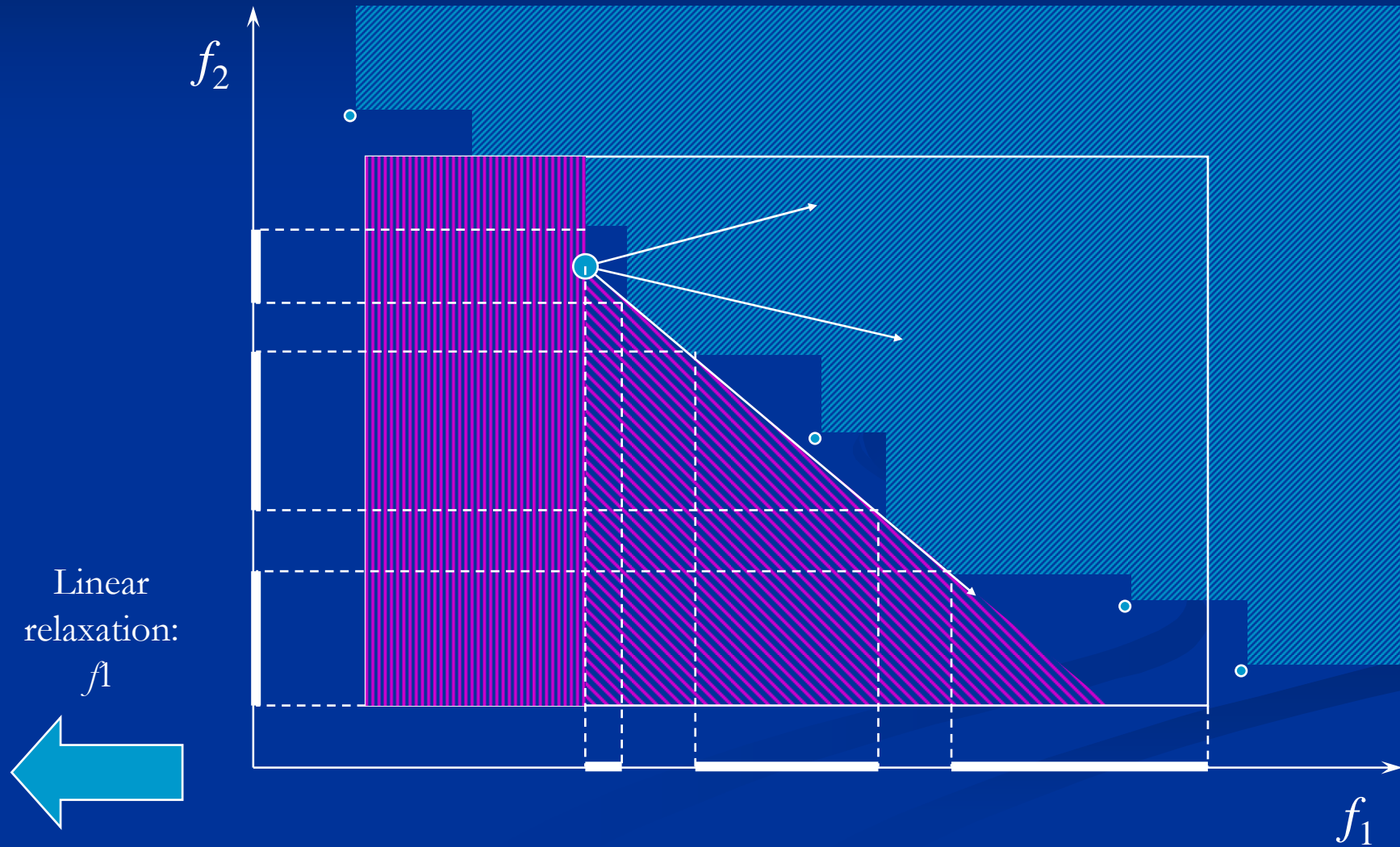
Reduced costs wrt f_2

- We can obtain the reduced costs wrt other objective functions
- They can be positive or negative
- If they are all positive
 - the solution is optimal also wrt f_2
 - otherwise, they show how the solution changes wrt f_2
- The criterion space of the linear relaxation is convex

Reduced costs wrt both functions



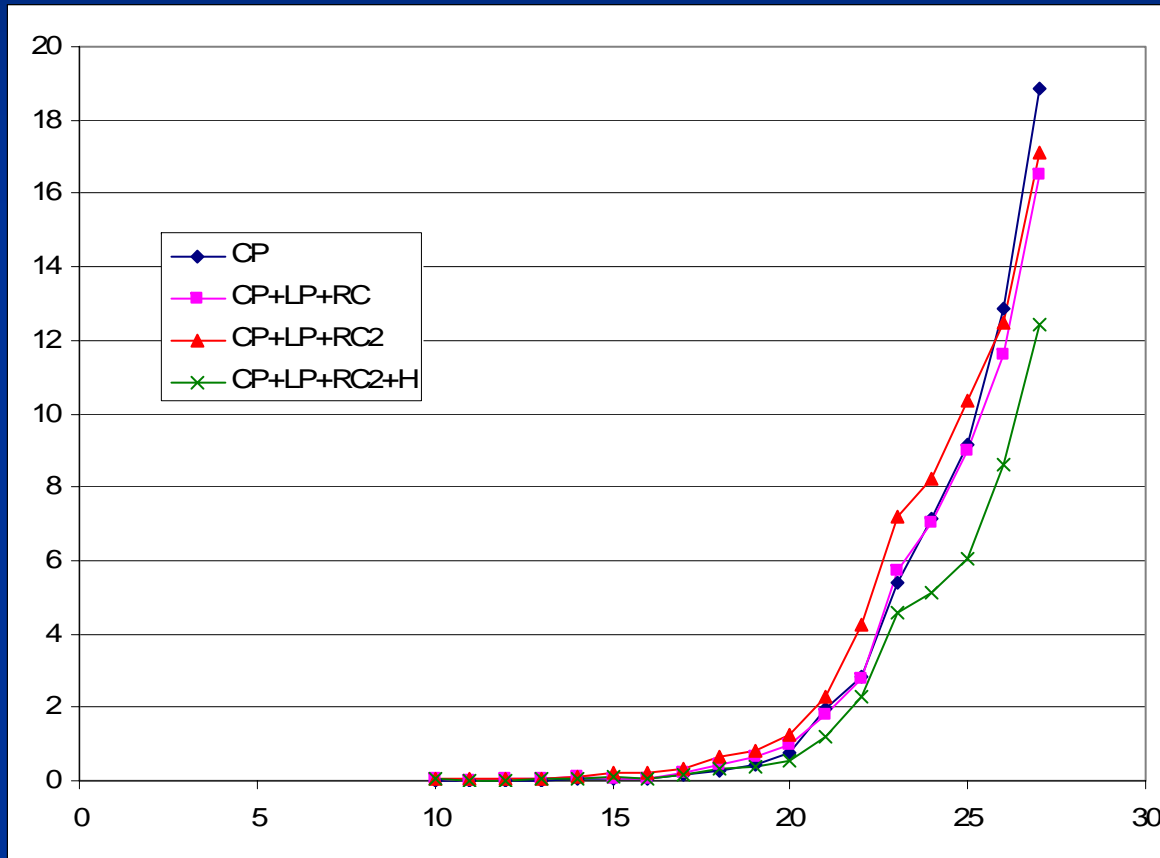
Reduced costs wrt both functions



Heuristics based on Reduced costs

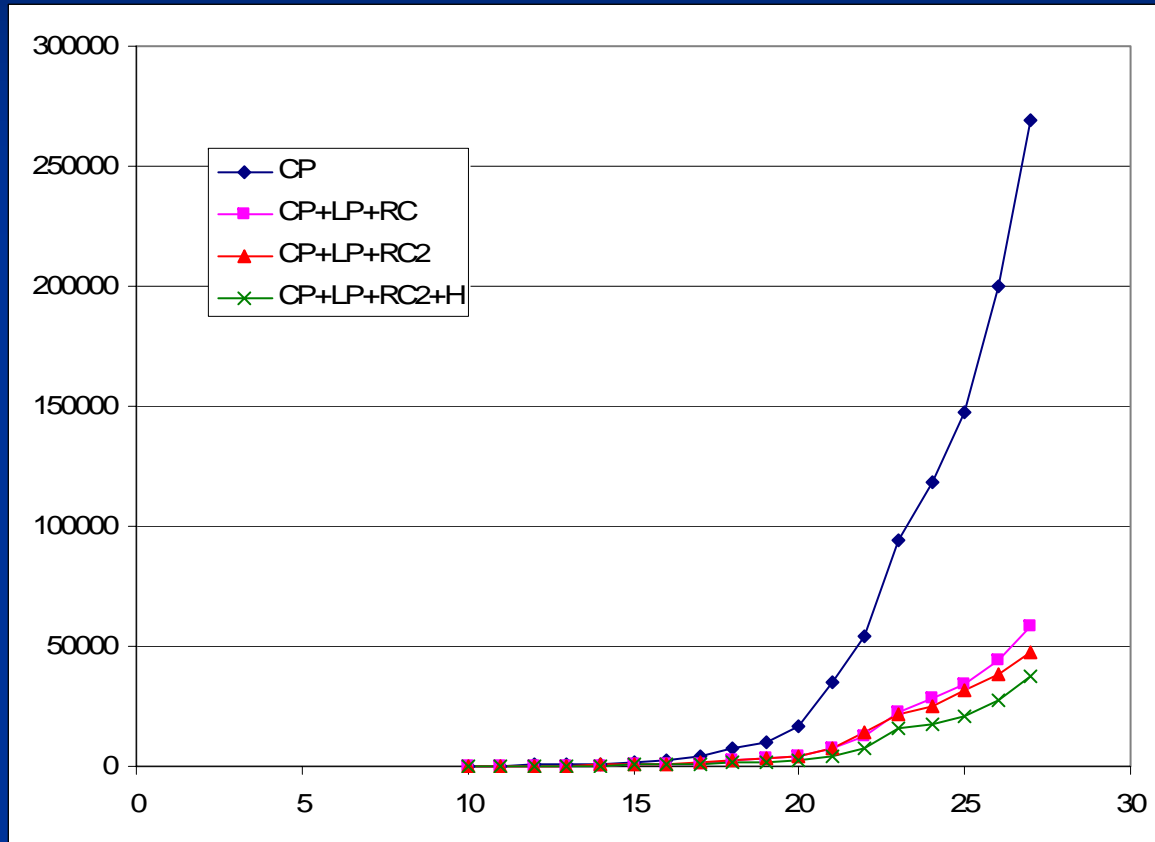
- If one variable has reduced costs of the same sign \rightarrow the two objective functions agree on the value that variable should take
- Heuristics: assign this value in early nodes of the search tree

Preliminary results



- Multi-knapsack
- timing results
- ECLiPSe + XpressMP

Preliminary results



■ Backtracks

Future work

- Experiment with problems better suited for the integration CP+LP
- Other uses of reduced costs (heuristics with LDS)
- Use of the dual solution for detecting optimality
- Sensitivity analysis
- Integrate CP with local search, genetic algorithms
- Implement in other systems (ILOG+CPLEX)?