

## Introduction

Context :

- WCSP framework
- Soft table constraints (extensional) of large arity with a default cost equal to 0 or  $k$
- Filtering approach based on the concept of Equivalence-Preserving Transformations

Goal :

- Exploit the efficiency of cost transfer operations to solve constraints of large arity

Principle :

- Algorithm to enforce a weak version of GAC on soft table constraints
- Combine both the techniques of Simple Tabular Reduction and cost transfer

## Background

A soft constraint  $c_S$  involves an ordered set  $S$  of variables and is defined as a cost function from  $l(S)$  to  $\{0, \dots, k\}$  where  $l(S)$  is the set of possible instantiations of  $S$ .

The existence of a nullary constraint  $c_\emptyset$  (a constant) as well as the presence of a unary constraint  $c_x$  for every variable  $x$  is assumed.

DEFINITION 1: The *extended* cost of an instantiation  $I \in l(S)$  on a soft constraint  $c_S$  is defined by  $ecost(c_S, I) = c_\emptyset + \sum_{x \in S} c_x(I[x]) + c_S(I)$ .

DEFINITION 2: A value  $(x, a)$  of a soft constraint  $c_S$  is  $GAC^w$ -consistent on  $c_S$  iff  $\exists I \in l(S) \mid I[x] = a \wedge c_S(I) = 0 \wedge ecost(c_S, I) < k$ . A soft constraint  $c_S$  is  $GAC^w$ -consistent iff every value of  $c_S$  is  $GAC^w$ -consistent.

## Algorithm

$GAC^w$ -WSTR( $c_S$ : soft constraint)

```

1: cnt ← 1
2: if default[cS] = k then
3:   traverse-k(cS, cnt)
4: else
5:   traverse-0(cS, cnt)  \\ default[cS] = 0
6:   pruneVars(cS)
7:   while Ssup ≠ ∅ do
8:     pick and delete x from Ssup
9:     α ← +∞
10:    for each a ∈ dom(x)
11:      if minCosts[cS][x][a] > 0 then
12:        project(cS, x, a, minCosts[cS][x][a])
13:        α ← min(α, cx(a))
14:    if α > 0 then
15:      unaryProject(x, α)
16:    if Ssup ≠ ∅ then
17:      cnt ++
18:      if default[cS] = k then
19:        traverse-k(cS, cnt)
20:      else
21:        traverse-0(cS, cnt)  \\ default[cS] = 0
22:    end while

```

Space complexity:  $O(tr + rd)$ . Time complexity:  $O(r^2(d+t))$  when default cost is  $k$ ,  $O(r^3 dt \log(t))$  when default cost is 0.

## Experiments

Series	#Inst	PFC-MRDAC-		Maintaining-		
		WSTR	GEN	GAC <sup>w</sup> -WSTR	AC*	FDAC
crossoft-herald	50	33	10	47	11	11
crossoft-puzzle	22	22	9	22	18	18
crossoft-vg	64	14	6	14	7	7
poker	18	10	2	10	5	5
rand-3 (rb)	48	20	29	20	32	30
rand-10	20	20	0	20	0	0
ergo	19	13	10	15	15	17
linkage	30	0	0	0	1	9
renault-mod	50	50	32	50	50	47

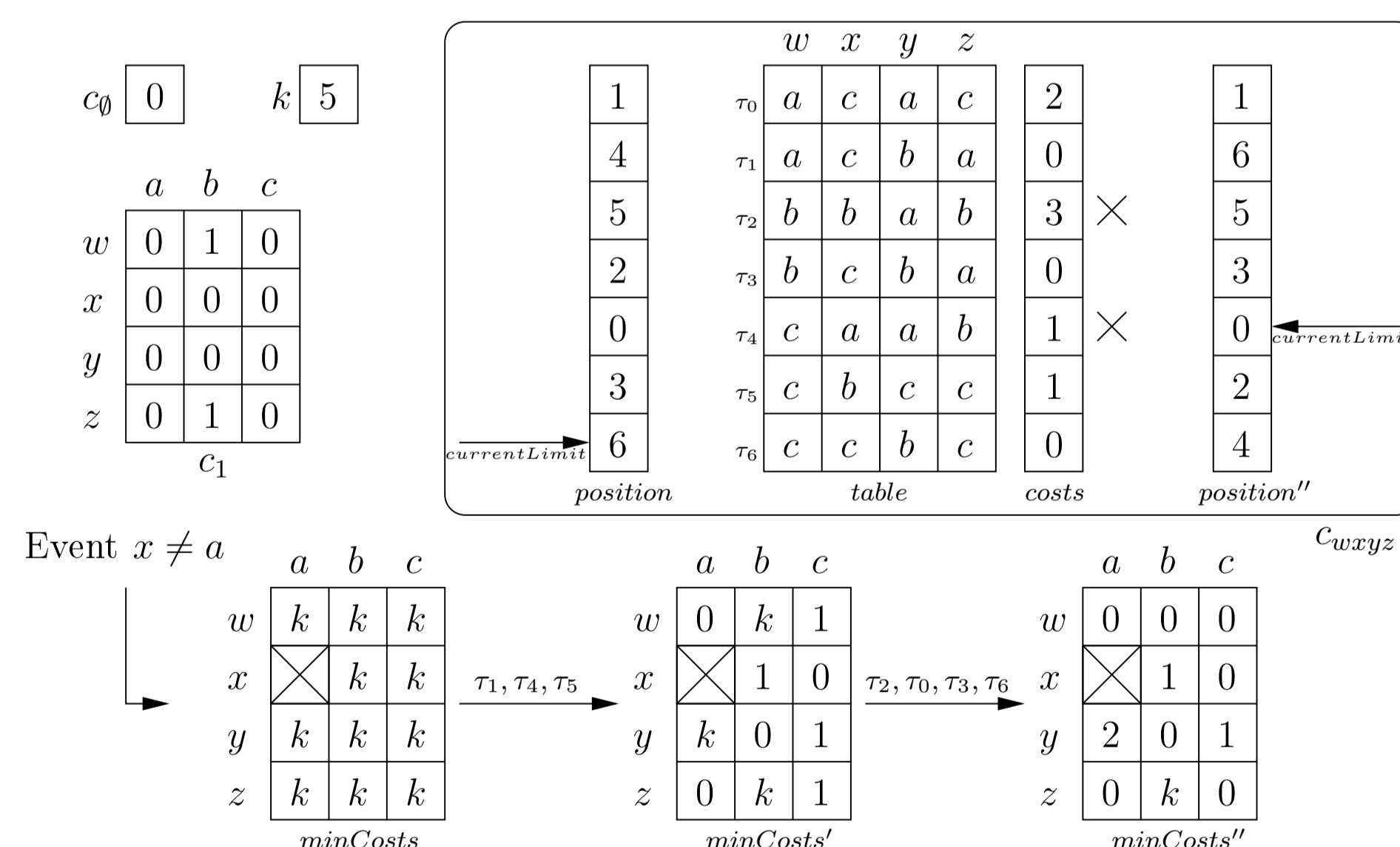
Number of solved instances per series (time-out of 1,200 seconds set per instance)

Instance (arity max)	PFC-MRDAC-		Maintaining-		
	WSTR	GEN	GAC <sup>w</sup> -WSTR	AC*	FDAC
crossoft-ogd-15-09 (7)	26.5	⊥	25.2	273	269
crossoft-ogd-23-01 (23)	⊥	⊥	565	⊥	⊥
crossoft-ogd-puzzle-18 (10)	6.29	⊥	6.66	⊥	⊥
crossoft-ogd-vg-5-6 (6)	0.4	155	0.77	31.5	32.3
poker-5 (5)	0.26	92.4	0.24	1.39	1.5
poker-6 (5)	0.38	463	0.39	6.58	6.99
poker-9 (5)	0.79	⊥	0.63	782	1022
poker-12 (5)	1.51	⊥	0.89	⊥	⊥
rb-3-12-12-30-0.630 (3)	4.13	1.2	3.61	0.79	0.86
rb-3-16-16-44-0.635 (3)	94.3	7.41	51.6	2.31	3.11
rb-3-20-20-60-0.632 (3)	614	34.4	830	24.3	23.3
pedigree1 (5)	⊥	⊥	890	819	35.0
barley (5)	⊥	⊥	40.7	23	20.3
cpcs422b (18)	7.4	113	8.61	58.3	111
link (4)	68.6	⊥	5.41	4.55	6.5
rand-10-20-10-5-9 (10)	3.94	⊥	2.39	⊥	⊥
rand-10-20-10-5-10 (10)	5.27	⊥	2.67	⊥	⊥
renault-mod-12 (10)	1.74	680	1.39	6.01	14.4
renault-mod-14 (10)	2.49	⊥	1.49	6.83	14.9

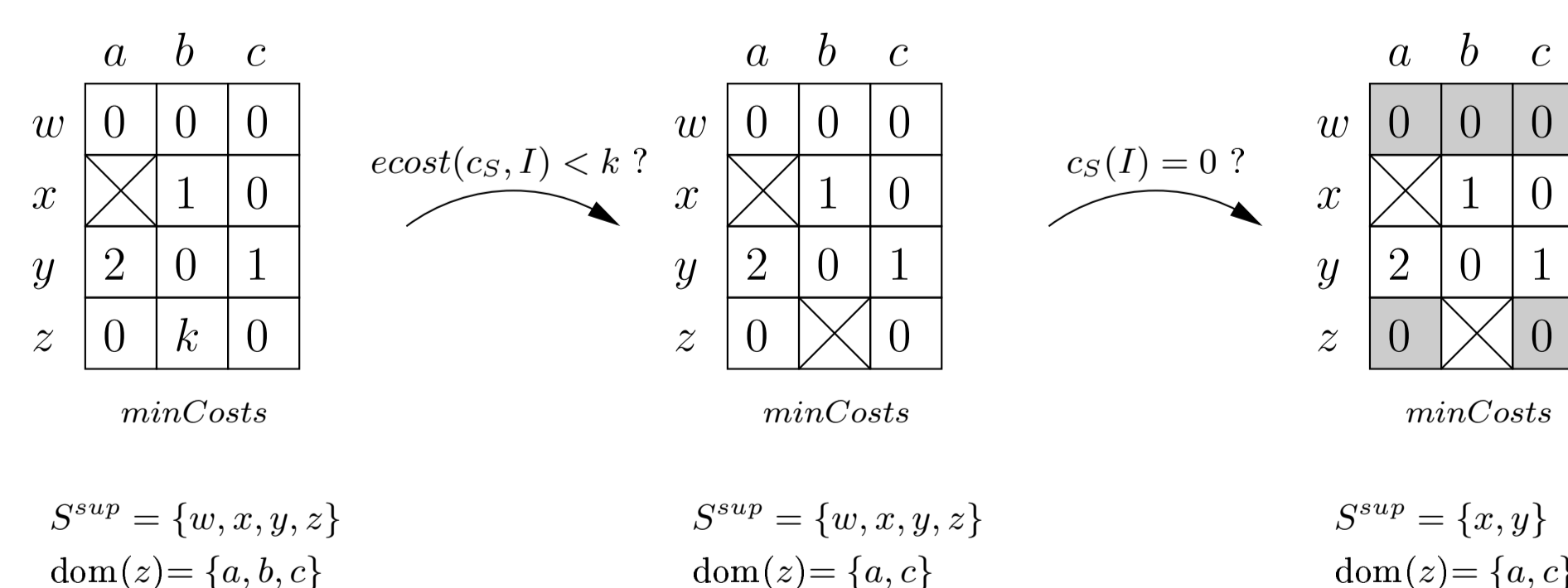
CPU time (in seconds) to prove optimality on various selected instances (time-out of 1,200 seconds set per instance, ⊥: time-out reached)

## Evolution of data structures

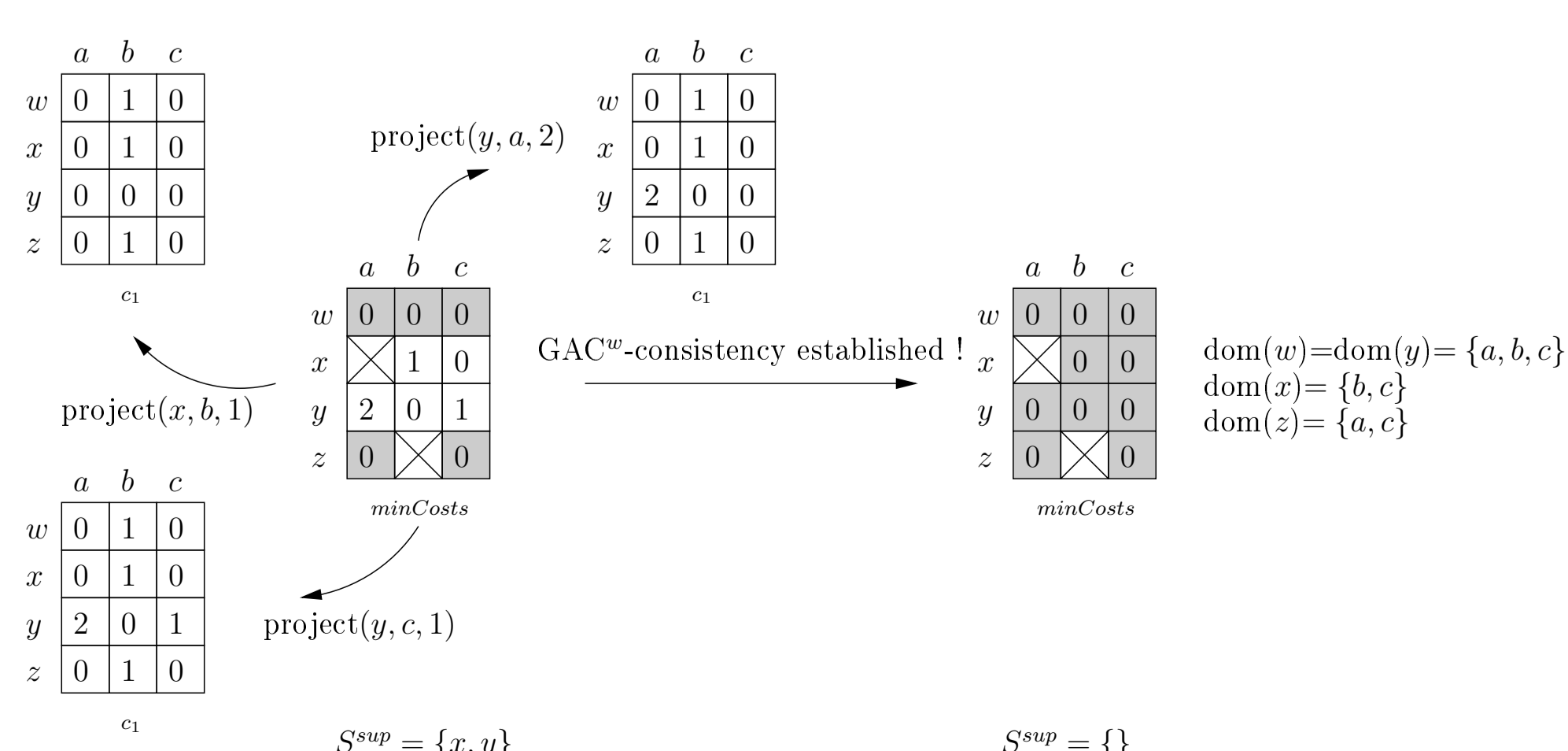
Step 1 : Compute minimum costs for values



Step 2 : Prune  $GAC^w$ -inconsistent values



Step 3 : Search again minimum costs for values after making successive projections



## Conclusion and future work

- Conclusion
  - New filtering algorithm enforcing a weak version of Generalized Arc Consistency called  $GAC^w$
  - Can be applied on soft table constraints with a default cost of either 0 or  $k$
  - A filtering method combining simple tabular reduction and cost transfer operations
  - Efficient approach compared to generic algorithms when soft table constraints have large arity
  - Generic algorithms not efficient to their full extent, particularly with cost transfer postponed
- Future work
  - Generalize our approach to soft table constraints with any default cost