

# Progress in *clasp* series 3

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# Outline

- 1 Motivation
- 2 Disjunctive solving
- 3 Optimization
- 4 Heuristics
- 5 Configuration
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- DPLL *smodels, dlv*  
SAT *assat, cmodels, lp2sat*  
CDCL *clasp, wasp*
- Objective: comprehensive description of *clasp's* series 3
- Features of *clasp* series 3
  - parallel solving of disjunctive logic programs
  - parallel optimization with orthogonal strategies
  - declarative support for specifying domain heuristics
  - a portfolio of prefabricated expert configurations and
  - an application programming interface for library integration
- Empirical study contrasting them for solving optimization problems

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# Solving disjunctive logic programs

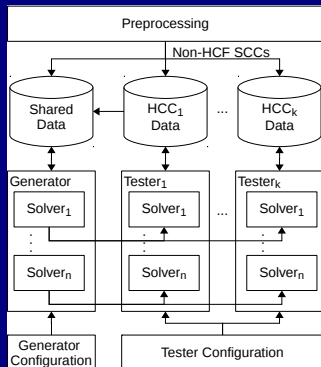
- Fact Solving DLPs leads to an elevated level of complexity
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  - `--pre` — Run preprocessing and exit
  - `gringo <file> | clasp --pre | cmodels`

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  - `gringo <file> | clasp --pre | lp2sat | minisat`

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# Optimization strategies

- Model-guided approach `--opt-strategy=bb, n`
  - classical branch-and-bound
  - SAT SAT...SAT UNSAT
  
- Core-guided approach `--opt-strategy=usc, n`
  - originated in MaxSAT community
  - UNSAT UNSAT...UNSAT SAT
  
- Combination via multi-threading
  - exchange of lower and upper bounds (in addition to nogoods)
  
- Enumeration of optimal models `--opt-mode=optN`
  - combinable with `--enum-mode`,  
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# Heuristic framework

- Change heuristic scores of atoms and signs `--heuristic=domain`

- Programmed heuristics expressed as a logic program

```
_heuristic (must be #shown)
init, factor, level, sign
```

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_heuristic(occurs(A,T),factor,T) :- action(A), time(T).
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- Structural heuristics invoked via command line options

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    - 8 atoms in `#minimize` statements

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➡ often boosts convergence to minimum

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    - 5 level and negative sign
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# Prefabricated configurations and portfolios

## ■ Option `--configuration`

<code>frumpy</code>	Use conservative defaults as used in earlier <i>clasp</i> versions
<code>jumpy</code>	Use more aggressive defaults (than <code>frumpy</code> )
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- Objective Study the interplay of the various techniques
- Subjects Optimization problems
  - Great practical relevance
  - Algorithmic challenge due to multiple SAT and UNSAT problems
- Experimental series I Sum-based optimization
  - core- and model-guided strategies
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- Experimental series II Inclusion-based optimization
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- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations

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--opt-strategy=bb --config=tweety
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--dom-mod=5,8 --opt-strategy=bb --config=tweety
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--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy
--config=myPortfolio4
  
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    - model-guided optimization strategy
    - heuristics preferring minimized atoms and assigning them to false
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  - \* = best configuration for respective optimization strategy
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## Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
15-puzzle (16)	260/ 5/ 90	45/ 0/ 100	425/ 9/ 62	266/ 5/ 83	21/ 0/ 100	249/ 5/ 88	9/ 0
Fastfood <sup>w</sup> (29)	9/ 0/ 100	290/ 13/ 55	30/ 0/ 100	22/ 0/ 100	290/ 14/ 67	10/ 0/ 100	7/ 0
Labyrinth (29)	445/ 18/ 75	299/ 11/ 62	365/ 14/ 84	395/ 15/ 79	250/ 10/ 66	442/ 19/ 58	229/ 9
Sokoban (28)	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	0/ 0
Tsp <sup>w</sup> (29)	600/ 29/ 57	600/ 29/ 0	600/ 29/ 100	600/ 29/ 70	600/ 29/ 32	600/ 29/ 73	600/ 29
Wbds (29)	600/ 29/ 70	421/ 19/ 34	600/ 29/ 82	600/ 29/ 31	394/ 17/ 67	600/ 29/ 72	397/ 17
Abstract <sup>m2</sup> (30)	19/ 0/ 100	99/ 0/ 100	311/ 13/ 57	20/ 0/ 100	73/ 2/ 94	21/ 0/ 100	6/ 0
Connected (26)	513/ 22/ 75	476/ 20/ 23	513/ 22/ 89	531/ 23/ 52	474/ 20/ 51	514/ 22/ 93	479/ 20
Crossing (30)	372/ 16/ 78	177/ 5/ 83	451/ 20/ 66	381/ 17/ 61	174/ 6/ 88	367/ 16/ 86	162/ 5
MaxClique (30)	593/ 29/ 20	50/ 0/ 100	528/ 23/ 61	370/ 13/ 75	23/ 0/ 100	313/ 8/ 91	21/ 0
Valves <sup>w</sup> (30)	508/ 24/ 79	543/ 27/ 10	561/ 28/ 7	515/ 25/ 87	561/ 28/ 55	513/ 25/ 92	518/ 25
Aspeed <sup>m2,w</sup> (30)	57/ 0/ 100	540/ 27/ 38	490/ 21/ 42	89/ 1/ 99	470/ 23/ 54	64/ 0/ 100	65/ 0
Expansion (30)	103/ 3/ 92	1/ 0/ 100	40/ 0/ 100	63/ 2/ 96	1/ 0/ 100	30/ 0/ 100	0/ 0
Repair (30)	113/ 1/ 97	0/ 0/ 100	10/ 0/ 100	32/ 0/ 100	1/ 0/ 100	44/ 0/ 100	1/ 0
Iscas85 (30)	129/ 4/ 96	0/ 0/ 100	158/ 7/ 88	134/ 4/ 92	0/ 0/ 100	306/ 13/ 71	0/ 0
Paranoid <sup>m2</sup> (30)	377/ 8/ 79	1/ 0/ 100	103/ 4/ 92	80/ 3/ 94	1/ 0/ 100	59/ 2/ 98	1/ 0
Trendy <sup>m4,w</sup> (30)	485/ 19/ 47	4/ 0/ 100	241/ 11/ 80	254/ 11/ 82	6/ 0/ 100	219/ 10/ 87	6/ 0
Metro <sup>w</sup> (30)	42/ 0/ 100	237/ 7/ 77	325/ 14/ 59	45/ 0/ 100	162/ 4/ 93	29/ 0/ 100	21/ 0
PartnerUnits (30)	234/ 5/ 94	111/ 2/ 93	150/ 4/ 87	225/ 8/ 82	103/ 1/ 97	251/ 9/ 83	97/ 0
Ricochet (30)	86/ 0/ 100	85/ 0/ 100	97/ 0/ 100	167/ 2/ 95	88/ 0/ 100	136/ 1/ 97	21/ 0
ShiftDesign <sup>m3</sup> (30)	600/ 30/ 19	23/ 0/ 100	105/ 5/ 86	436/ 16/ 67	44/ 1/ 99	351/ 13/ 80	29/ 0
Timetabling <sup>w</sup> (30)	407/ 17/ 63	8/ 0/ 100	205/ 10/ 84	208/ 10/ 84	31/ 1/ 97	280/ 11/ 73	4/ 0
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
15-puzzle (16)	260/ 5/ 90	45/ 0/ 100	425/ 9/ 62	266/ 5/ 83	21/ 0/ 100	249/ 5/ 88	9/ 0
Fastfood <sup>w</sup> (29)	9/ 0/ 100	290/ 13/ 55	30/ 0/ 100	22/ 0/ 100	290/ 14/ 67	10/ 0/ 100	7/ 0
Labyrinth (29)	445/ 18/ 75	299/ 11/ 62	365/ 14/ 84	395/ 15/ 79	250/ 10/ 66	442/ 19/ 58	229/ 9
Sokoban (28)	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	0/ 0
Tsp <sup>w</sup> (29)	600/ 29/ 57	600/ 29/ 0	600/ 29/ 100	600/ 29/ 70	600/ 29/ 32	600/ 29/ 73	600/ 29
Wbds (29)	600/ 29/ 70	421/ 19/ 34	600/ 29/ 82	600/ 29/ 31	394/ 17/ 67	600/ 29/ 72	397/ 17
Abstract <sup>m2</sup> (30)	19/ 0/ 100	99/ 0/ 100	311/ 13/ 57	20/ 0/ 100	73/ 2/ 94	21/ 0/ 100	6/ 0
Connected (26)	513/ 22/ 75	476/ 20/ 23	513/ 22/ 89	531/ 23/ 52	474/ 20/ 51	514/ 22/ 93	479/ 20
Crossing (30)	372/ 16/ 78	177/ 5/ 83	451/ 20/ 66	381/ 17/ 61	174/ 6/ 88	367/ 16/ 86	162/ 5
MaxClique (30)	593/ 29/ 20	50/ 0/ 100	528/ 23/ 61	370/ 13/ 75	23/ 0/ 100	313/ 8/ 91	21/ 0
Valves <sup>w</sup> (30)	508/ 24/ 79	543/ 27/ 10	561/ 28/ 7	515/ 25/ 87	561/ 28/ 55	513/ 25/ 92	518/ 25
Aspeed <sup>m2,w</sup> (30)	57/ 0/ 100	540/ 27/ 38	490/ 21/ 42	89/ 1/ 99	470/ 23/ 54	64/ 0/ 100	65/ 0
Expansion (30)	103/ 3/ 92	1/ 0/ 100	40/ 0/ 100	63/ 2/ 96	1/ 0/ 100	30/ 0/ 100	0/ 0
Repair (30)	113/ 1/ 97	0/ 0/ 100	10/ 0/ 100	32/ 0/ 100	1/ 0/ 100	44/ 0/ 100	1/ 0
Iscas85 (30)	129/ 4/ 96	0/ 0/ 100	158/ 7/ 88	134/ 4/ 92	0/ 0/ 100	306/ 13/ 71	0/ 0
Paranoid <sup>m2</sup> (30)	377/ 8/ 79	1/ 0/ 100	103/ 4/ 92	80/ 3/ 94	1/ 0/ 100	59/ 2/ 98	1/ 0
Trendy <sup>m4,w</sup> (30)	485/ 19/ 47	4/ 0/ 100	241/ 11/ 80	254/ 11/ 82	6/ 0/ 100	219/ 10/ 87	6/ 0
Metro <sup>w</sup> (30)	42/ 0/ 100	237/ 7/ 77	325/ 14/ 59	45/ 0/ 100	162/ 4/ 93	29/ 0/ 100	21/ 0
PartnerUnits (30)	234/ 5/ 94	111/ 2/ 93	150/ 4/ 87	225/ 8/ 82	103/ 1/ 97	251/ 9/ 83	97/ 0
Ricochet (30)	86/ 0/ 100	85/ 0/ 100	97/ 0/ 100	167/ 2/ 95	88/ 0/ 100	136/ 1/ 97	21/ 0
ShiftDesign <sup>m3</sup> (30)	600/ 30/ 19	23/ 0/ 100	105/ 5/ 86	436/ 16/ 67	44/ 1/ 99	351/ 13/ 80	29/ 0
Timetabling <sup>w</sup> (30)	407/ 17/ 63	8/ 0/ 100	205/ 10/ 84	208/ 10/ 84	31/ 1/ 97	280/ 11/ 73	4/ 0
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## Results for sum-based optimization

Benchmark	model			core			heuristic	model*			core*			heuristic*			multi
15-puzzle (16)	260	5	90	45	0	100	425/ 9/ 62	266/ 5/ 83	21/ 0/ 100	249/ 5/ 88	9/ 0						
Fastfood <sup>w</sup> (29)	9/ 0/ 100	290/ 13/ 55	30/ 0/ 100	290/ 14/ 67	10/ 0/ 100												
Labyrinth (29)	445/ 18/ 75	299/ 11/ 62	365/ 14/ 84	395/ 15/ 79	250/ 10/ 66	442/ 19/ 58	229/ 9										
Sokoban (28)	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	0/ 0											
Tsp <sup>w</sup> (29)	600/ 29/ 57	600/ 29/ 0	600/ 29/ 100	600/ 29/ 70	600/ 29/ 32	600/ 29/ 73	600/ 29										
Wbds (29)	600/ 29/ 70	421/ 19/ 34	600/ 29/ 82	600/ 29/ 31	394/ 17/ 67	600/ 29/ 72	397/ 17										
Abstract <sup>m2</sup> (30)	19/ 0/ 100	99/ 0/ 100	311/ 13/ 57	20/ 0/ 100	73/ 2/ 94	21/ 0/ 100	6/ 0										
Connected (26)	513/ 22/ 75	476/ 20/ 23	513/ 22/ 89	531/ 23/ 52	474/ 20/ 51	514/ 22/ 93	479/ 20										
Crossing (30)	372/ 16/ 78	177/ 5/ 83	451/ 20/ 66	381/ 17/ 61	174/ 6/ 88	367/ 16/ 86	162/ 5										
MaxClique (30)	593/ 29	20	50	0	100	528/ 23/ 61	370/ 13/ 75	23/ 0/ 100	313/ 8/ 91	21/ 0							
Valves <sup>w</sup> (30)	508/ 24/ 79	543/ 27/ 10	561/ 28/ 7	515/ 25/ 87	561/ 28/ 55	513/ 25/ 92	518/ 25										
Aspeed <sup>m2,w</sup> (30)	57/ 0/ 100	540/ 27/ 38	490/ 21/ 42	89/ 1/ 99	470/ 23/ 54	64/ 0/ 100	65/ 0										
Expansion (30)	103/ 3/ 92	1/ 0/ 100	40/ 0/ 100	63/ 2/ 96	1/ 0/ 100	30/ 0/ 100	0/ 0										
Repair (30)	113/ 1/ 97	0/ 0/ 100	10/ 0/ 100	32/ 0/ 100	1/ 0/ 100	44/ 0/ 100	1/ 0										
Iscas85 (30)	129/ 4/ 96	0/ 0/ 100	158/ 7/ 88	134/ 4/ 92	0/ 0/ 100	306/ 13/ 71	0/ 0										
Paranoid <sup>m2</sup> (30)	377/ 8/ 79	1/ 0/ 100	103/ 4/ 92	80/ 3/ 94	1/ 0/ 100	59/ 2/ 98	1/ 0										
Trendy <sup>m4,w</sup> (30)	485/ 19	47	4/ 0	100	241/ 11/ 80	254/ 11/ 82	6/ 0/ 100	219/ 10/ 87	6/ 0								
Metro <sup>w</sup> (30)	42/ 0/ 100	23/ 7/ 77	325/ 14/ 59	45/ 0/ 100	162/ 4/ 93	29/ 0/ 100	21/ 0										
PartnerUnits (30)	234/ 5/ 94	111/ 2/ 93	150/ 4/ 87	225/ 8/ 82	103/ 1/ 97	251/ 9/ 83	97/ 0										
Ricochet (30)	86/ 0/ 100	85/ 0/ 100	97/ 0/ 100	167/ 2/ 95	88/ 0/ 100	136/ 1/ 97	21/ 0										
ShiftDesign <sup>m3</sup> (30)	600/ 30/ 19	23/ 0/ 100	105/ 5/ 86	436/ 16/ 67	44/ 1/ 99	351/ 13/ 80	29/ 0										
Timetabling <sup>w</sup> (30)	407/ 17/ 63	8/ 0/ 100	205/ 10/ 84	208/ 10/ 84	31/ 1/ 97	280/ 11/ 73	4/ 0										
SUM (636)	6553/ 259/ 1731	4011/ 160/ 1676	6307/ 263/ 1724	5435/ 213/ 1829	3768/ 156/ 1859	5397/ 212/ 1942	2674/ 105										
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5										

## Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
15-puzzle (16)	260/ 5/ 90	45/ 0/ 100	425/ 9/ 62	266/ 5/ 83	21/ 0/ 100	249/ 5/ 88	9/ 0
Fastfood <sup>w</sup> (29)	9/ 0/ 100	290/ 13/ 55	30/ 0/ 100	22/ 0/ 100	290/ 14/ 67	10/ 0/ 100	7/ 0
Labyrinth (29)	445/ 18/ 75	299/ 11/ 62	365/ 14/ 84	395/ 15/ 79	250/ 10/ 66	442/ 19/ 58	229/ 9
Goldfish (29)	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	1/ 0/ 100	0/ 0
Tsp <sup>w</sup> (29)	600/ 29/ 57	600/ 29/ 0	600/ 29/ 100	600/ 29/ 70	600/ 29/ 32	600/ 29/ 73	600/ 29
Woods (29)	600/ 29/ 70	421/ 17/ 54	600/ 29/ 82	600/ 29/ 31	394/ 17/ 67	600/ 29/ 72	397/ 17
Abstract <sup>m2</sup> (30)	19/ 0/ 100	99/ 0/ 100	311/ 13/ 57	20/ 0/ 100	73/ 2/ 94	21/ 0/ 100	6/ 0
Connected (26)	513/ 22/ 75	476/ 20/ 23	513/ 22/ 89	531/ 23/ 52	474/ 20/ 51	514/ 22/ 93	479/ 20
Crossing (30)	372/ 16/ 78	177/ 5/ 83	451/ 20/ 66	381/ 17/ 61	174/ 6/ 88	367/ 16/ 86	162/ 5
MaxClique (30)	593/ 29/ 20	50/ 0/ 100	528/ 23/ 61	370/ 13/ 75	23/ 0/ 100	313/ 8/ 91	21/ 0
Valves <sup>w</sup> (30)	508/ 24/ 79	543/ 27/ 10	561/ 28/ 7	515/ 25/ 87	561/ 28/ 55	513/ 25/ 92	518/ 25
Aspeed <sup>m2,w</sup> (30)	57/ 0/ 100	540/ 27/ 38	490/ 21/ 42	89/ 1/ 99	470/ 23/ 54	64/ 0/ 100	65/ 0
Expansion (30)	103/ 3/ 92	1/ 0/ 100	40/ 0/ 100	63/ 2/ 96	1/ 0/ 100	30/ 0/ 100	0/ 0
Repair (30)	113/ 1/ 97	0/ 0/ 100	10/ 0/ 100	32/ 0/ 100	1/ 0/ 100	44/ 0/ 100	1/ 0
Iscas85 (30)	129/ 4/ 96	0/ 0/ 100	158/ 7/ 88	134/ 4/ 92	0/ 0/ 100	306/ 13/ 71	0/ 0
Paranoid <sup>m2</sup> (30)	377/ 8/ 79	1/ 0/ 100	103/ 4/ 92	80/ 3/ 94	1/ 0/ 100	59/ 2/ 98	1/ 0
Trendy <sup>m4,w</sup> (30)	485/ 19/ 47	4/ 0/ 100	241/ 11/ 80	254/ 11/ 82	6/ 0/ 100	219/ 10/ 87	6/ 0
Metro <sup>w</sup> (30)	42/ 0/ 100	237/ 7/ 77	325/ 14/ 59	45/ 0/ 100	162/ 4/ 93	29/ 0/ 100	21/ 0
PartnerUnits (30)	234/ 5/ 94	111/ 2/ 93	150/ 4/ 87	225/ 8/ 82	103/ 1/ 97	251/ 9/ 83	97/ 0
Ricochet (30)	86/ 0/ 100	85/ 0/ 100	97/ 0/ 100	167/ 2/ 95	88/ 0/ 100	136/ 1/ 97	21/ 0
ShiftDesign <sup>m3</sup> (30)	600/ 30/ 19	23/ 0/ 100	105/ 5/ 86	436/ 16/ 67	44/ 1/ 99	351/ 13/ 80	29/ 0
Timetabling <sup>w</sup> (30)	407/ 17/ 63	8/ 0/ 100	205/ 10/ 84	208/ 10/ 84	31/ 1/ 97	280/ 11/ 73	4/ 0
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
- *core\** `--opt-strategy=usc,3 --config=crafty`
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
- *multi* `--config=myPortfolio4`

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
  - model-guided optimization with exponentially increasing steps
  - configuration trendy
- *core\** `--opt-strategy=usc,3 --config=crafty`
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
- *multi* `--config=myPortfolio4`



# Results for sum-based optimization

Benchmark		<i>model</i>	<i>core</i>	<i>heuristic</i>	<i>model*</i>	<i>core*</i>	<i>heuristic*</i>	<i>multi</i>
<i>SUM</i>	(636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
<i>AVG</i>		298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
  - model-guided optimization with exponentially increasing steps
  - configuration trendy
- *core\** `--opt-strategy=usc,3 --config=crafty`
  - core-guided optimization with algorithm *oll*
  - configuration crafty
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
- *multi* `--config=myPortfolio4`

# Results for sum-based optimization

Benchmark		model	core	heuristic	model*	core*	heuristic*	multi
SUM	(636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
AVG		298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
  - model-guided optimization with exponentially increasing steps
  - configuration trendy — *frequent restarts*
- *core\** `--opt-strategy=usc,3 --config=crafty`
  - core-guided optimization with algorithm *oll*
  - configuration crafty — *infrequent restarts*
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
- *multi* `--config=myPortfolio4`

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
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## ■ Configurations

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- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
- *core\** `--opt-strategy=usc,3 --config=crafty`
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
  - hierarchic model-guided optimization
  - heuristics preferring to assign false to minimized atoms
- *multi* `--config=myPortfolio4`

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	2674/105
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## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
- *core\** `--opt-strategy=usc,3 --config=crafty`  
  - *most problems solved* (among single-threaded strategies)
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`  
  - *best anytime behaviour* (among single-threaded strategies)
- *multi* `--config=myPortfolio4`

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	<b>2674/105</b>
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
- *core\** `--opt-strategy=usc,3 --config=crafty`
  - *most problems solved* (among single-threaded strategies)
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
  - *best anytime behaviour* (among single-threaded strategies)
- *multi* `--config=myPortfolio4`
  - *faster and more problems solved*

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	<b>2674/105</b>
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- *model\** `--opt-strategy=bb,2 --config=trendy`
- *core\** `--opt-strategy=usc,3 --config=crafty`
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
- *multi* `--config=myPortfolio4`
  - *faster and more problems solved*
  - *improves over the virtually best single-threaded configuration*

# Results for sum-based optimization

Benchmark	model	core	heuristic	model*	core*	heuristic*	multi
SUM (636)	6553/259/1731	4011/160/1676	6307/263/1724	5435/213/1829	3768/156/1859	5397/212/1942	<b>2674/105</b>
AVG	298/ 12/ 79	182/ 7/ 76	287/ 12/ 78	247/ 10/ 83	171/ 7/ 85	245/ 10/ 88	122/ 5

## ■ Configurations

- *model* `--opt-strategy=bb --config=tweety`
- *core* `--opt-strategy=usc --config=tweety`
- *heuristic* `--dom-mod=5,8 --opt-strategy=bb --config=tweety`
- *model\** `--opt-strategy=bb,2 --config=trendy`
- *core\** `--opt-strategy=usc,3 --config=crafty`
- *heuristic\** `--dom-mod=4,8 --opt-strategy=bb,1 --config=trendy`
- *multi* `--config=myPortfolio4`

- *faster and more problems solved*
- *improves over the virtually best single-threaded configuration*



**¡SYNERGY AT WORK!**

## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations `--configuration=tweety`
  - (enumeration only)



## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations `--configuration=tweety`
  - *meta*
  - *heuristic*
  - *meta-heuristic*
  - *meta-heuristic-recording* (enumeration only)

## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations (Computation) `--configuration=tweety`
  - *meta*
  - *heuristic*
  - *meta-heuristic*
  - *meta-heuristic-recording* (enumeration only)

## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations (Computation) `--configuration=tweety`
  - *meta*
    - saturation-based, disjunctive encodings generated via *metasp*
  - *heuristic*
  - *meta-heuristic*
  - *meta-heuristic-recording* (enumeration only)

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- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations (Computation) `--configuration=tweety`
  - *meta*
    - saturation-based, disjunctive encodings generated via *metasp*
  - *heuristic* `--dom-mod=5,16`
    - heuristics preferring shown atoms and assigning them to false
  - *meta-heuristic*
  - *meta-heuristic-recording* (enumeration only)

## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations (Computation) `--configuration=tweety`
  - *meta*
    - saturation-based, disjunctive encodings generated via *metasp*
  - *heuristic* `--dom-mod=5,16`
    - heuristics preferring shown atoms and assigning them to false
  - *meta-heuristic*
    - use heuristics to reduce number of invalid solution candidates
  - *meta-heuristic-recording* (enumeration only)

## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations (Enumeration) `--configuration=tweety`
  - *meta*
    - saturation-based, disjunctive encodings generated via *metasp*
  - *heuristic*
    - heuristics preferring shown atoms and assigning them to false
  - *meta-heuristic*
  - *meta-heuristic-recording* (enumeration only)

## Experimental setup, series II

- Limits 600 seconds wall-clock time and 6 GB of memory per run
- Measurements
  - Average time (timeout accounts for 600 seconds)
  - Number of timeouts
  - Relative quality (score similar to that of ASP'14)
- Configurations (Enumeration) `--configuration=tweety`
  - *meta*
    - saturation-based, disjunctive encodings generated via *metasp*
    - enumeration in polynomial space
  - *heuristic*
    - heuristics preferring shown atoms and assigning them to false
    - enumeration in exponential space
  - *meta-heuristic*
  - *meta-heuristic-recording* (enumeration only)

## Results for inclusion-based optimization

Benchmark	meta	heuristic	meta-heur.	meta	heuristic	meta-heuristic	meta-heur.-rec
15-puzzle (16)	25/ 0	14/ 0	23/ 0	321/ 7/ 91	408/ 9/ 75	354/ 7/ 69	444/ 9/ 38
Fastfood (29)	1/ 0	0/ 0	0/ 0	356/ 14/ 59	210/ 9/ 100	348/ 14/ 65	268/ 10/ 71
Labyrinth (29)	356/ 16	84/ 3	347/ 15	600/ 29/ 72	600/ 29/ 91	600/ 29/ 73	600/ 29/ 61
Sokoban (28)	22/ 0	1/ 0	12/ 0	22/ 0/ 95	1/ 0/ 100	23/ 0/ 96	12/ 0/ 98
Tsp (29)	7/ 0	0/ 0	7/ 0	600/ 29/ 48	600/ 29/ 100	600/ 29/ 58	600/ 29/ 44
Wbds (29)	219/ 7	23/ 1	38/ 1	600/ 29/ 53	600/ 29/ 82	600/ 29/ 72	600/ 29/ 49
Connected (26)	109/ 3	0/ 0	61/ 2	532/ 23/ 35	532/ 23/ 100	532/ 23/ 60	532/ 23/ 70
Crossing (30)	98/ 1	14/ 0	14/ 0	600/ 30/ 32	600/ 30/ 99	600/ 30/ 42	600/ 30/ 76
MaxClique (30)	189/ 3	0/ 0	3/ 0	600/ 30/ 25	600/ 30/ 100	600/ 30/ 50	600/ 30/ 75
Valves (30)	600/ 30	560/ 28	600/ 30	600/ 30/ 98	560/ 28/ 100	600/ 30/ 98	600/ 30/ 98
Aspeed (30)	600/ 30	4/ 0	581/ 29	600/ 30/ 73	600/ 30/ 100	600/ 30/ 74	600/ 30/ 75
Expansion (30)	600/ 30	0/ 0	600/ 30	600/ 30/ 75	298/ 14/ 100	600/ 30/ 75	600/ 30/ 75
Repair (30)	552/ 26	0/ 0	5/ 0	595/ 29/ 25	438/ 20/ 100	589/ 29/ 50	481/ 21/ 77
Iscas85 (30)	60/ 3	0/ 0	0/ 0	600/ 30/ 25	600/ 30/ 100	600/ 30/ 50	600/ 30/ 75
Paranoid (30)	191/ 6	1/ 0	16/ 0	600/ 30/ 25	600/ 30/ 100	600/ 30/ 50	600/ 30/ 75
Trendy (30)	411/ 18	3/ 0	133/ 0	581/ 29/ 27	580/ 29/ 100	581/ 29/ 51	581/ 29/ 75
Metro (30)	126/ 5	54/ 1	33/ 1	571/ 27/ 42	576/ 28/ 70	581/ 28/ 65	573/ 27/ 78
PartnerUnits(30)	600/ 30	168/ 4	507/ 9	600/ 30/ 42	168/ 4/ 98	596/ 29/ 61	501/ 9/ 78
Ricochet (30)	405/ 16	57/ 0	266/ 10	388/ 14/ 46	56/ 0/ 100	285/ 11/ 77	264/ 10/ 83
Timetabling (30)	600/ 30	16/ 0	85/ 1	600/ 30/ 27	283/ 14/ 98	600/ 30/ 51	336/ 15/ 82
SUM (576)	5773/254	999/ 37	3332/ 128	10568/500/10138	8908/415/1913	10490/497/1285	9991/450/1453
AVG	289/ 13	50/ 2	167/ 6	528/ 25/ 51	445/ 21/ 96	525/ 25/ 64	500/ 22/ 73



# Results for inclusion-based optimization

Benchmark	<i>meta</i>	<i>heuristic</i>	<i>meta-heur.</i>	<i>meta</i>	<i>heuristic</i>	<i>meta-heuristic</i>	<i>meta-heur.-rec</i>
<i>SUM</i> (576)	5773/254999/ 37	3332/ 128	10568/500/1013	8908/415/1913	10490/497/1285	9991/450/1453	
<i>AVG</i>	289/ 13/ 50/ 2	167/ 6	528/ 25/ 51	445/ 21/ 96	525/ 25/ 64	500/ 22/ 73	

## ■ Configurations (Computation)

- *meta*
- *heuristic*
- *meta-heuristic*
- *meta-heuristic-recording*

# Results for inclusion-based optimization

Benchmark	<i>meta</i>	<i>heuristic</i>	<i>meta-heur.</i>	<i>meta</i>	<i>heuristic</i>	<i>meta-heuristic</i>	<i>meta-heur.-rec</i>
<i>SUM</i> (576)	5773/254	<b>999/ 37</b>	3332/ 128	10568/500/1013	8908/415/1913	10490/497/1285	9991/450/1453
<i>AVG</i>	289/ 13	50/ 2	167/ 6	528/ 25/ 51	445/ 21/ 96	525/ 25/ 64	500/ 22/ 73

## ■ Configurations (Computation)

- *meta*
- *heuristic*
  - *faster and more problems solved*
- *meta-heuristic*
- *meta-heuristic-recording*

# Results for inclusion-based optimization

Benchmark	<i>meta</i>	<i>heuristic</i>	<i>meta-heur.</i>	<i>meta</i>	<i>heuristic</i>	<i>meta-heuristic</i>	<i>meta-heur.-rec</i>
<i>SUM</i> (576)	5773/254999/ 37	3332/ 128	10568/500/1013	<b>8908/415/1913</b>	10490/497/1285	9991/450/1453	
<i>AVG</i>	289/ 13	50/ 2	167/ 6	528/ 25/ 51	445/ 21/ 96	525/ 25/ 64	500/ 22/ 73

## ■ Configurations (Enumeration)

- *meta*
- *heuristic*
  - *faster and more problems solved*
  - *more models enumerated*
- *meta-heuristic*
- *meta-heuristic-recording*

# Results for inclusion-based optimization

Benchmark	<i>meta</i>	<i>heuristic</i>	<i>meta-heur.</i>	<i>meta</i>	<i>heuristic</i>	<i>meta-heuristic</i>	<i>meta-heur.-rec</i>
<i>SUM</i> (576)	5773/254999/ 37	3332/ 128	10568/500/1013	8908/415/1913	10490/497/1285	9991/450/1453	
<i>AVG</i>	289/ 13	50/ 2	167/ 6	528/ 25/ 51	445/ 21/ 96	525/ 25/ 64	500/ 22/ 73

## ■ Configurations (Enumeration)

- *meta*
  - **worst performance**
- *heuristic*
- *meta-heuristic*
- *meta-heuristic-recording*

# Results for inclusion-based optimization

Benchmark	<i>meta</i>	<i>heuristic</i>	<i>meta-heur.</i>	<i>meta</i>	<i>heuristic</i>	<i>meta-heuristic</i>	<i>meta-heur.-rec</i>
<i>SUM</i> (576)	5773/254999/ 373332/ 128	10568/500/10138908/415/191310490/497/12859991/450/1453					
<i>AVG</i>	289/ 13/ 50/ 2/ 167/ 6	528/ 25/ 51/ 445/ 21/ 96/ 525/ 25/ 64/ 500/ 22/ 73					

## ■ Configurations (Enumeration)

- *meta*
  - worst performance
- *heuristic*
- *meta-heuristic*
  - better performance
- *meta-heuristic-recording*

# Results for inclusion-based optimization

Benchmark	<i>meta</i>	<i>heuristic</i>	<i>meta-heur.</i>	<i>meta</i>	<i>heuristic</i>	<i>meta-heuristic</i>	<i>meta-heur.-rec</i>
<i>SUM</i> (576)	5773/254999/ 37	3332/ 128	10568/500/1013	8908/415/1913	10490/497/1285	9991/450/1453	
<i>AVG</i>	289/ 13/ 50/ 2	167/ 6	528/ 25/ 51	445/ 21/ 96	525/ 25/ 64	500/ 22/ 73	

## ■ Configurations (Enumeration)

- *meta*
  - worst performance
- *heuristic*
- *meta-heuristic*
  - better performance
- *meta-heuristic-recording*
  - even better performance

(enumeration only)

# Outline

- 1 Motivation
- 2 Disjunctive solving
- 3 Optimization
- 4 Heuristics
- 5 Configuration
- 6 Experiments
- 7 Summary**

# Summary

- Various ASP solving techniques
  - Disjunctive solving
  - Optimization
  - Heuristics
  - Configuration
- Empirical study of their impact on optimization problems
- Paper
  - Multi-threading
  - C++ library
- <http://potassco.sourceforge.net>



# Summary

- Various ASP solving techniques
  - Disjunctive solving
  - Optimization
  - Heuristics
  - Configuration
- Empirical study of their impact on optimization problems
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# Summary

- Various ASP solving techniques
  - Disjunctive solving
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