The Fourth International Verification of Neural Networks Competition (VNN-COMP 2023): Summary and Results

Stanley Bak, Christopher Brix, Taylor Johnson, Changliu Liu, and David Shriver

Abstract

This report summarizes the fourth International Verification of Neural Networks Competition (VNN-COMP 2023), held as a part of the 6th Workshop on Formal Methods for ML-Enabled Autonomous Systems (FoMLAS) that was collocated with the 35th International Conference on Computer-Aided Verification (CAV). The goal of the competition is to provide an objective comparison of the state-of-the-art methods in neural network verification, in terms of scalability and speed. Along this line, we used standard formats (ONNX for neural networks and VNNLIB for specifications), standard hardware (all tools are run by the organizers on AWS), and tool parameters provided by the tool authors. This report summarizes the rules, benchmarks, participating tools, results, and lessons learned from this competition.

1 Total Score

Table 1: Overall Score

#	Tool	Score
1	α - β -CROWN	839.5
2	Marabou	642.4
3	PyRAT	550.7
4	NeuralSAT	535.7
5	nnenum	430.5
6	NNV	257.1
7	FastBATLLNN	100.0

^{*}S. Bak is with Stony Brook University, stanley.bak@stonybrook.edu.

 $^{^{\}dagger}\mathrm{C}.$ Brix is with RWTH Aachen University, <code>brix@cs.rwth-aachen.de.</code>

[‡]T. Johnson is with Vanderbilt University, taylor.johnson@vanderbilt.edu.

[§]C. Liu is with Carnegie Mellon University, cliu6@andrew.cmu.edu.

 $[\]P_D$. Shriver, davidshriver@outlook.com.

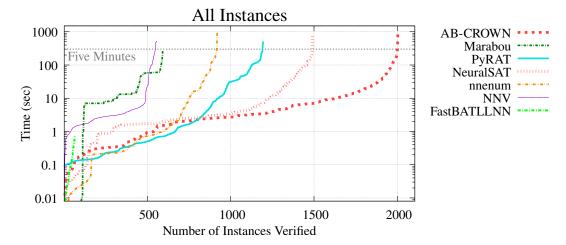


Figure 1: Cactus Plot for All Instances.

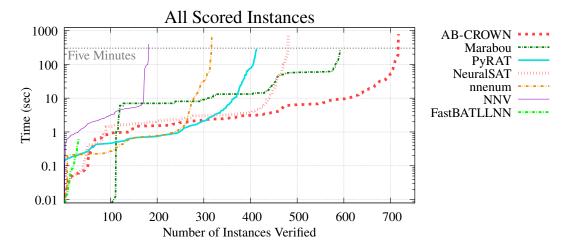


Figure 2: Cactus Plot for All Scored Instances.

2 Scored Benchmarks

Table 2: Benchmark 2023-acasxu

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	nnenum	139	47	0	0	1860	100.0%
2	α - β -CROWN	139	47	0	0	1860	100.0%
3	NeuralSAT	138	46	0	0	1840	98.9%
4	PyRAT	137	45	0	0	1820	97.8%
5	Marabou	135	46	0	0	1810	97.3%
6	NNV	68	27	0	0	950	51.1%

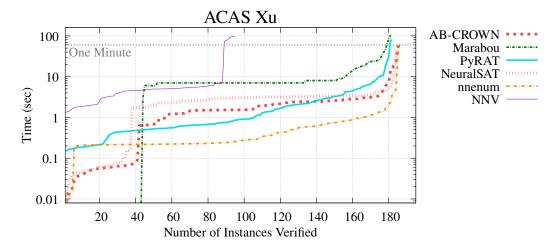


Figure 3: Cactus Plot for ACAS Xu.

Table 3: Benchmark 2023-cgan

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	8	13	0	0	210	100.0%
2	PyRAT	8	11	0	0	190	90.5%
3	nnenum	6	11	0	0	170	81.0%
4	NeuralSAT	3	11	0	0	140	66.7%
5	NNV	3	11	0	0	140	66.7%
6	Marabou	0	13	0	0	130	61.9%

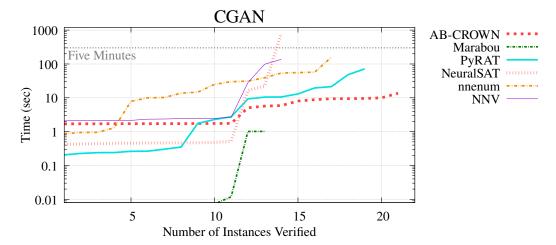


Figure 4: Cactus Plot for CGAN.

Table 4: Benchmark 2023-collins-rul-cnn

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	nnenum	35	27	0	0	620	100.0%
2	NeuralSAT	35	27	0	0	620	100.0%
3	Marabou	35	27	0	0	620	100.0%
4	α - β -CROWN	35	27	0	0	620	100.0%
5	PyRAT	33	27	0	0	600	96.8%
6	NNV	23	27	0	0	500	80.6%

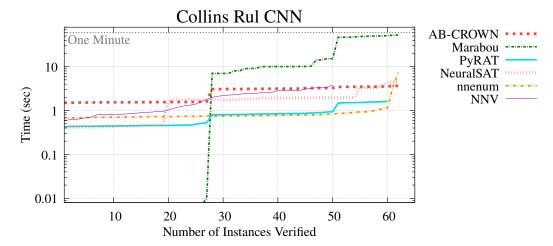


Figure 5: Cactus Plot for Collins Rul CNN.

Table 5: Benchmark 2023-dist-shift

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	67	5	0	0	720	100.0%
2	PyRAT	66	5	0	0	710	98.6%
3	NeuralSAT	66	5	0	0	710	98.6%
4	Marabou	55	5	0	0	600	83.3%
5	NNV	0	4	0	0	40	5.6%

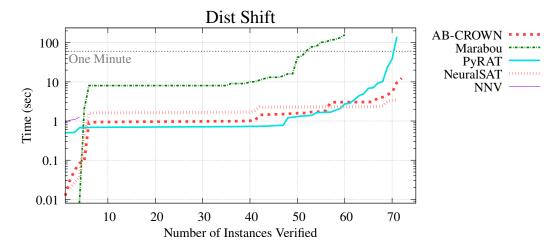


Figure 6: Cactus Plot for Dist Shift.

Table 6: Benchmark 2023-ml4acopf

#	Tool	Verified	Falsified	Fastest	Penalty	\mathbf{Score}	Percent
1	α - β -CROWN	18	1	0	0	190	100.0%

Table 7: Benchmark 2023-nn4sys

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	192	0	0	2	1620	100.0%
2	NeuralSAT	81	0	0	2	510	31.5%
3	Marabou	33	0	0	1	180	11.1%
4	PyRAT	38	0	0	2	80	4.9%
5	nnenum	20	0	0	2	-100	0%
6	NNV	0	2	0	8	-1180	0%

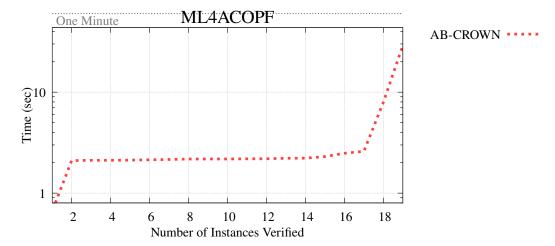


Figure 7: Cactus Plot for ML4ACOPF.

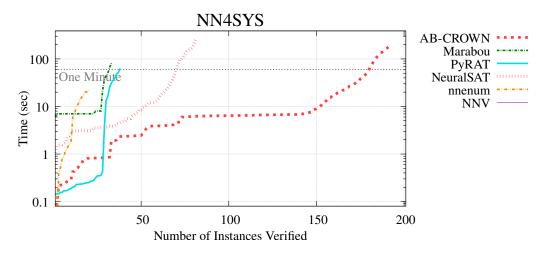


Figure 8: Cactus Plot for NN4SYS.

Table 8: Benchmark 2023-tllverifybench

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	NeuralSAT	15	17	0	0	320	100.0%
2	${\it FastBATLLNN}$	15	17	0	0	320	100.0%
3	α - β -CROWN	15	17	0	0	320	100.0%
4	PyRAT	10	12	0	0	220	68.8%
5	Marabou	5	17	0	0	220	68.8%
6	nnenum	2	16	0	0	180	56.2%
7	NNV	1	16	0	0	170	53.1%

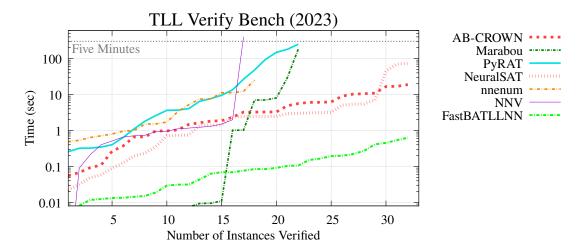


Figure 9: Cactus Plot for TLL Verify Bench (2023).

Table 9: Benchmark 2023-traffic-signs-recognition

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	Marabou	0	18	0	1	30	100.0%
2	PyRAT	0	7	0	1	-80	0%
3	NeuralSAT	0	31	0	4	-290	0%
4	α - β -CROWN	0	39	0	3	-60	0%

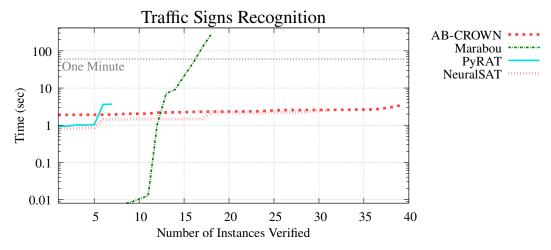


Figure 10: Cactus Plot for Traffic Signs Recognition.

Table 10: Benchmark 2023-vggnet16

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	15	0	0	0	150	100.0%
2	nnenum	14	0	0	0	140	93.3%
3	PyRAT	13	1	0	0	140	93.3%
4	NeuralSAT	5	1	0	0	60	40.0%
5	Marabou	2	1	0	0	30	20.0%

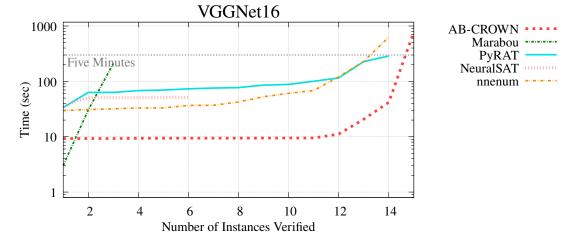


Figure 11: Cactus Plot for VGGNet16.

Table 11: Benchmark 2023-vit

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	Marabou	200	0	0	0	2000	100.0%
2	α - β -CROWN	79	0	0	0	790	39.5%

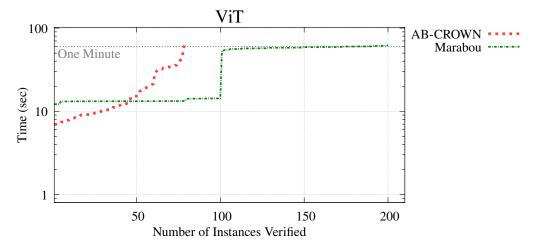


Figure 12: Cactus Plot for ViT.

3 Unscored Benchmarks

Table 12: Benchmark 2022-carvana-unet-2022

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	39	0	0	0	390	100.0%

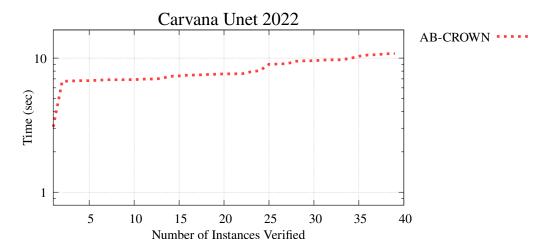


Figure 13: Cactus Plot for Carvana Unet 2022.

Table 13: Benchmark 2022-cifar100-tinyimagenet-resnet

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	69	3	0	0	720	100.0%
2	NeuralSAT	56	3	0	0	590	81.9%

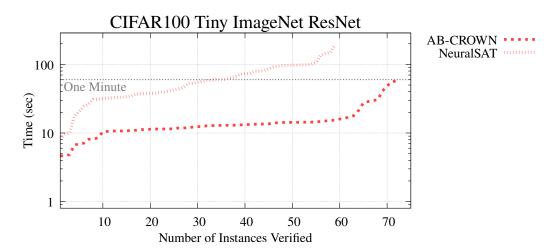


Figure 14: Cactus Plot for CIFAR100 Tiny ImageNet ResNet.

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	NeuralSAT	148	42	0	0	1900	100.0%
2	α - β -CROWN	148	41	0	0	1890	99.5%
3	PyRAT	96	39	0	0	1350	71.1%
4	nnenum	66	19	0	0	850	44.7%
5	NNV	32	6	0	0	380	20.0%

Table 14: Benchmark 2022-cifar2020

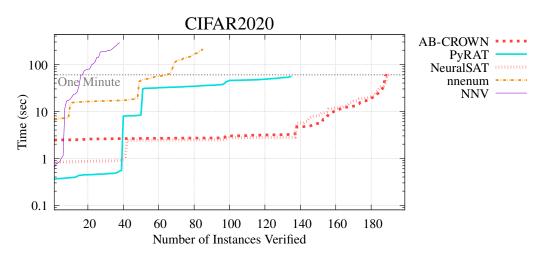


Figure 15: Cactus Plot for CIFAR2020.

Table 15: Benchmark 2022-cifar-biasfield

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	68	1	0	0	690	100.0%
2	NeuralSAT	67	1	0	0	680	98.6%
3	PyRAT	51	1	0	0	520	75.4%
4	nnenum	18	0	0	0	180	26.1%

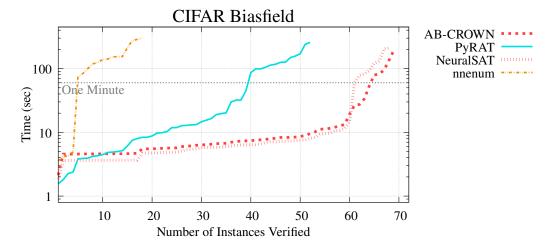


Figure 16: Cactus Plot for CIFAR Biasfield.

Table 16: Benchmark 2022-mnist-fc

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	68	18	0	0	860	100.0%
2	NeuralSAT	46	18	0	0	640	74.4%
3	nnenum	48	11	0	0	590	68.6%
4	PyRAT	35	16	0	0	510	59.3%
5	NNV	30	4	0	0	340	39.5%

Table 17: Benchmark 2022-nn4sys

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	150	0	0	2	1200	100.0%
2	NeuralSAT	76	0	0	2	460	38.3%
3	nnenum	20	0	0	2	-100	0%
4	PyRAT	12	0	0	2	-180	0%
5	NNV	0	2	0	8	-1180	0%

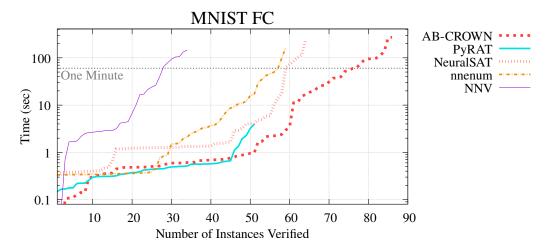


Figure 17: Cactus Plot for MNIST FC.

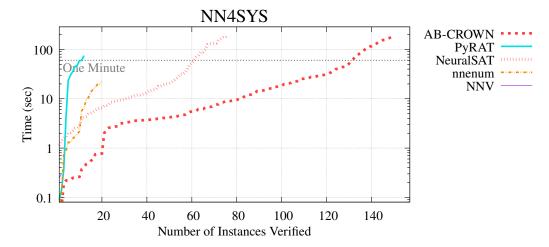


Figure 18: Cactus Plot for NN4SYS.

Table 18: Benchmark 2022-oval21

#	Tool	$\mathbf{Verified}$	Falsified	Fastest	Penalty	\mathbf{Score}	Percent
1	α - β -CROWN	25	1	0	0	260	100.0%
2	NeuralSAT	19	1	0	0	200	76.9%
3	nnenum	3	1	0	0	40	15.4%
4	NNV	4	0	0	0	40	15.4%
5	PyRAT	1	1	0	0	20	7.7%

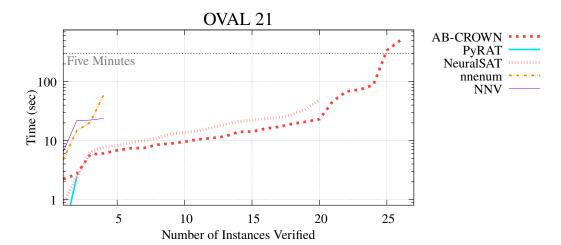


Figure 19: Cactus Plot for OVAL 21.

Table 19: Benchmark 2022-reach-prob-density

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	nnenum	22	14	0	0	360	100.0%
2	α - β -CROWN	22	14	0	0	360	100.0%
3	NeuralSAT	22	12	0	0	340	94.4%
4	PyRAT	17	7	0	0	240	66.7%
5	NNV	9	0	0	0	90	25.0%

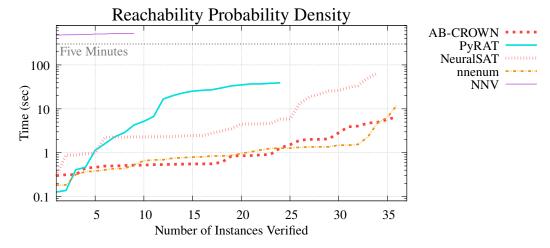


Figure 20: Cactus Plot for Reachability Probability Density.

Table 20: Benchmark 2022-rl-benchmarks

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	NeuralSAT	193	103	0	0	2960	100.0%
2	α - β -CROWN	193	103	0	0	2960	100.0%
3	nnenum	191	103	0	0	2940	99.3%
4	NNV	177	90	0	0	2670	90.2%
5	PyRAT	191	96	0	3	2420	81.8%

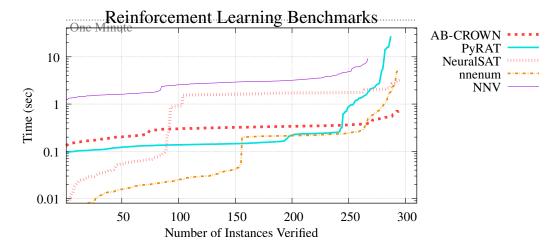


Figure 21: Cactus Plot for Reinforcement Learning Benchmarks.

Table 21: Benchmark 2022-sri-resnet-a

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	20	12	0	0	320	100.0%
2	NeuralSAT	18	12	0	0	300	93.8%
3	PyRAT	5	11	0	0	160	50.0%

Table 22: Benchmark 2022-sri-resnet-b

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	NeuralSAT	28	11	0	0	390	100.0%
2	α - β -CROWN	28	11	0	0	390	100.0%
3	PyRAT	13	11	0	0	240	61.5%
4	NNV	1	0	0	1	-140	0%

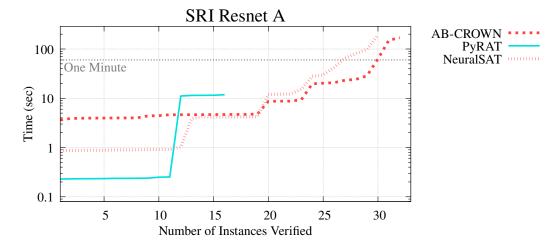


Figure 22: Cactus Plot for SRI Resnet A.

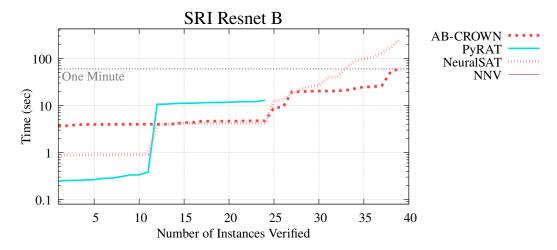


Figure 23: Cactus Plot for SRI Resnet B.

Table 23: Benchmark 2022-tllverifybench

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	NeuralSAT	11	21	0	0	320	100.0%
2	${\it FastBATLLNN}$	11	21	0	0	320	100.0%
3	α - β -CROWN	11	21	0	0	320	100.0%
4	PyRAT	9	17	0	0	260	81.2%
5	nnenum	1	21	0	0	220	68.8%
6	NNV	0	21	0	0	210	65.6%

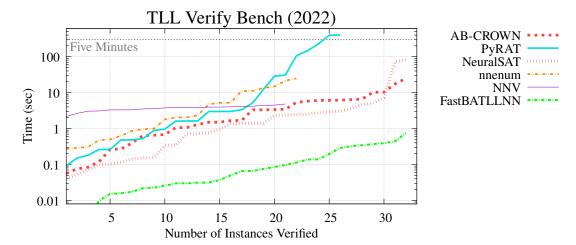


Figure 24: Cactus Plot for TLL Verify Bench (2022).

Table 24: Benchmark 2022-vggnet16-2022

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	14	1	0	0	150	100.0%
2	nnenum	11	1	0	0	120	80.0%
3	PyRAT	9	1	0	0	100	66.7%
4	NeuralSAT	5	1	0	0	60	40.0%

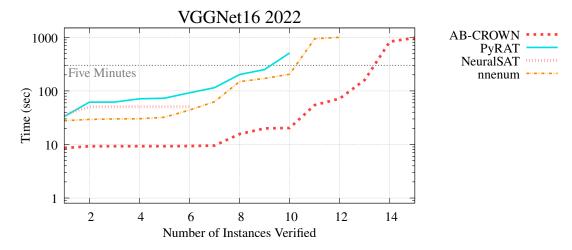


Figure 25: Cactus Plot for VGGNet16 2022.

Table 25: Benchmark 2023-cctsdb-yolo

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	11	28	0	0	390	100.0%

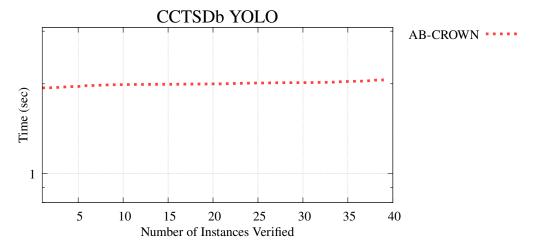


Figure 26: Cactus Plot for CCTSDb YOLO.

Table 26: Benchmark 2023-collins-yolo-robustness

#	Tool	Verified	Falsified	Fastest	Penalty	\mathbf{Score}	Percent
1	PyRAT	0	6	0	0	60	100.0%
2	α - β -CROWN	0	6	0	0	60	100.0%

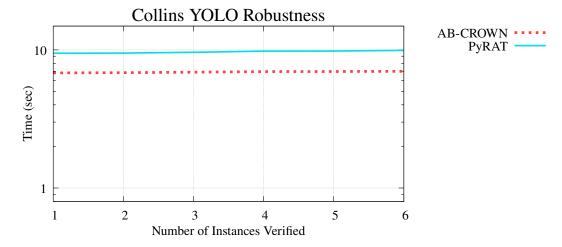


Figure 27: Cactus Plot for Collins YOLO Robustness.

Table 27: Benchmark 2023-metaroom

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	94	5	0	0	990	100.0%
2	NeuralSAT	92	5	0	0	970	98.0%
3	PyRAT	93	2	0	0	950	96.0%
4	nnenum	51	2	0	0	530	53.5%

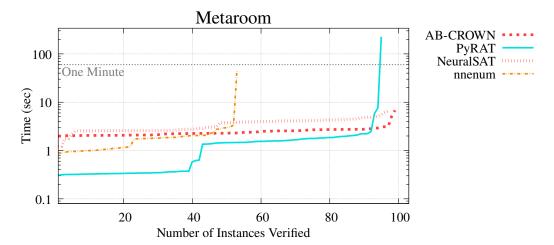


Figure 28: Cactus Plot for Metaroom.

Table 28: Benchmark 2023-yolo

#	Tool	Verified	Falsified	Fastest	Penalty	Score	Percent
1	α - β -CROWN	63	0	0	0	630	100.0%
2	PyRAT	41	0	0	0	410	65.1%
3	NNV	0	0	0	41	-6150	0%

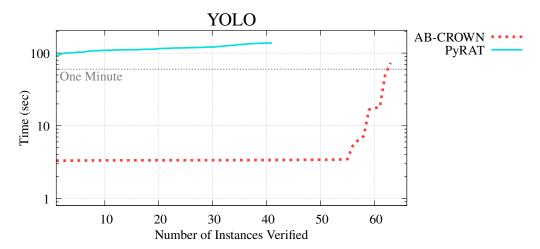


Figure 29: Cactus Plot for YOLO.

4 Stats

Table 29: Overhead

#	Tool	Seconds
1	FastBATLLNN	0.3
2	nnenum	0.9
3	Marabou	1.1
4	PyRAT	3.4
5	NeuralSAT	3.6
6	α - β -CROWN	5.7
7	NNV	15.9

Table 30: Num Benchmarks Participated

#	Tool	Count
1	α-β-CROWN	10
2	Marabou	9
3	PyRAT	8
4	NeuralSAT	8
5	nnenum	6
6	NNV	6
7	${\bf FastBATLLNN}$	1

Table 31: Num Instances Verified

#	Tool	Count
1	α - β -CROWN	717
2	Marabou	592
3	NeuralSAT	481
4	PyRAT	413
5	nnenum	317
6	NNV	182
7	FastBATLLNN	32

Table 32: Num SAT

#	Tool	Count
1	α - β -CROWN	149
2	NeuralSAT	138
3	Marabou	127
4	PyRAT	108
5	nnenum	101
6	NNV	87
7	FastBATLLNN	17

Table 33: Num UNSAT

#	Tool	Count
1	α - β -CROWN	568
2	Marabou	465
3	NeuralSAT	343
4	PyRAT	305
5	nnenum	216
6	NNV	95
7	FastBATLLNN	15

Table 34: Incorrect Results (or Missing CE)

#	Tool	Count
1	NNV	8
2	NeuralSAT	6
3	α - β -CROWN	5
4	PyRAT	3
5	nnenum	2
6	Marabou	2

5 Detailed Results

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Acasxu	0	UNSAT	2.47	7.02	1.39	3.23	0.43	-	-
2023 Acasxu	1	UNSAT	2.40	7.02	1.60	3.16	0.42	-	-
2023 Acasxu	2	UNSAT	2.46	7.02	2.32	3.23	0.60	-	-
2023 Acasxu	3	UNSAT	2.45	7.02	1.82	3.16	0.62	-	-
2023 Acasxu	4	UNSAT	2.36	7.02	1.29	3.15	0.49	-	-
2023 Acasxu	5	UNSAT		7.02	1.58	3.15	0.76	-	-
2023 Acasxu	6	UNSAT		7.02	1.38	3.18	0.50	-	-
2023 Acasxu	7	UNSAT		7.02	1.14	3.14	0.58	-	-
2023 Acasxu	8	UNSAT		7.02	0.92	3.13	0.50	-	-
2023 Acasxu	9		2.43	7.02	1.93	3.15	0.74	-	-
2023 Acasxu	10	UNSAT		8.03	2.56	3.29	0.94 0.71	-	-
2023 Acasxu 2023 Acasxu	$\frac{11}{12}$	UNSAT		7.02 7.02	2.06	3.16	0.63	-	_
2023 Acasxu 2023 Acasxu	13	UNSAT UNSAT	2.45	9.03	1.85 3.35	3.20	0.03	_	_
2023 Acasxu 2023 Acasxu	14	UNSAT		8.03	2.95	3.37	0.81	_	-
2023 Acasxu	15		2.96	26.1	5.93	3.40	1.41	_	_
2023 Acasxu 2023 Acasxu	16	UNSAT		18.1	5.88	3.43	1.22	_	_
2023 Acasxu	17		3.16	24.1	7.45	3.41	61.4	_	_
2023 Acasxu	18	UNSAT	2.43	7.02	2.07	3.16	0.64	_	_
2023 Acasxu	19	UNSAT		8.02	2.16	3.16	0.59	_	_
2023 Acasxu	20	UNSAT		7.02	2.06	3.21	0.72	_	_
2023 Acasxu	21	UNSAT	2.45	7.02	1.70	3.23	0.60	_	_
2023 Acasxu	22	UNSAT		8.03	2.75	3.35	0.84	-	_
2023 Acasxu	23	UNSAT		12.0	4.89	3.39	1.58	-	_
2023 Acasxu	24	UNSAT	2.83	19.1	5.11	3.40	1.30	-	_
2023 Acasxu	25	UNSAT	2.83	16.1	4.49	3.44	1.08	-	-
2023 Acasxu	26	UNSAT	3.59	39.2	6.42	3.56	0.98	-	-
2023 Acasxu	27	UNSAT	2.59	9.03	3.02	3.35	1.02	-	-
2023 Acasxu	28	UNSAT	2.37	7.02	2.20	3.17	0.76	-	-
2023 Acasxu	29	UNSAT	2.46	7.02	2.01	3.17	0.65	-	-
2023 Acasxu	30	UNSAT	2.43	8.03	1.98	3.23	0.59	-	-
2023 Acasxu	31	UNSAT		8.03	3.00	3.34	0.94	-	-
2023 Acasxu	32	UNSAT		23.1	6.47	3.48	1.86	-	-
2023 Acasxu	33	UNSAT	3.21	32.2	10.6	3.47	1.38	-	-
2023 Acasxu	34	UNSAT		23.1	5.55	3.43	1.16	-	-
2023 Acasxu	35		3.30	43.2	9.29	3.48	2.39	-	-
2023 Acasxu	36	UNSAT	2.43	7.02	1.92	3.17	0.60	-	-
2023 Acasxu	37	UNSAT		8.02 7.02	2.18	3.21	$0.79 \\ 0.67$	_	-
2023 Acasxu 2023 Acasxu	38 39	UNSAT	2.43	7.02		3.18	0.73	_	-
2023 Acasxu 2023 Acasxu	40	UNSAT UNSAT		8.02	1.69 2.59	3.19	0.73	_	-
2023 Acasxu	41	UNSAT		13.1	4.22	3.37	1.05	_	_
2023 Acasxu	42		2.81	11.0	4.28	3.37	1.03	_	_
2023 Acasxu	43		3.12	24.1	7.49	3.45	1.17	_	_
2023 Acasxu	44	UNSAT		16.1	6.23	3.36	1.37	_	_
2023 Acasxu	45	UNSAT		15.1	3.67	3.61	0.72	-	_
2023 Acasxu	46	SAT	0.06	< 0.01	0.97	4.42	0.29	-	-
2023 Acasxu	47	SAT	1.96	3.02	10.1	4.71	0.67	-	-
2023 Acasxu	48	SAT	0.04	< 0.01	0.44	4.14	0.34	-	-
2023 Acasxu	49	SAT	7.04	-	23.6	5.45	0.29	-	-
2023 Acasxu	50	SAT	4.15	< 0.01	8.46	4.12	0.86	-	-
2023 Acasxu	51	UNSAT	2.86	18.1	4.35	3.36	0.79	-	-
2023 Acasxu	52	UNSAT		25.1	4.78	3.35	1.27	-	-
2023 Acasxu	53	UNSAT		21.1	4.32	3.36	0.90	-	-
2023 Acasxu	54	SAT	0.04	< 0.01	0.53	0.07	0.24	-	-
2023 Acasxu	55	SAT	0.06	< 0.01	0.45	0.05	0.22	3.16	-
2023 Acasxu	56	SAT	0.03	< 0.01	0.54	0.05	0.22	1.98	-
2023 Acasxu	57	SAT	0.01	< 0.01	0.19	0.10	0.22	- 10	-
2023 Acasxu	58	SAT	0.06	< 0.01	0.49	0.08	0.22	3.13	-
2023 Acasxu	59 60	SAT	0.06	< 0.01	0.37	0.07	0.22	1.89	-
2023 Acassu	60 61	SAT	0.04	< 0.01	0.49	0.06	0.21	1.90	-
2023 Acasxu 2023 Acasxu	62	SAT SAT	$0.04 \\ 0.05$	<0.01 <0.01	0.43 0.55	$0.06 \\ 0.08$	0.22 0.36	2.13	_
2023 Acasxu 2023 Acasxu	63	SAT	0.05	< 0.01	0.35 0.45	0.08	0.30	2.58	_
LOLD IICABAU	00	DAI	0.00	√0.01	5.45	0.00	0.44	2.00	

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Acasxu	64	SAT	1.61	< 0.01	2.25	4.13	0.23	-	-
2023 Acasxu	65 66	UNSAT	59.0	- <0.01	0.60	0.07	4.38	2.01	-
2023 Acasxu 2023 Acasxu	66 67	SAT SAT	$0.05 \\ 0.07$	<0.01 <0.01	$0.69 \\ 0.47$	0.07 0.08	0.21 0.22	2.91 1.99	-
2023 Acasxu	68	SAT	0.07	< 0.01	0.47	0.03	0.23	1.71	_
2023 Acasxu	69	SAT	0.06	< 0.01	1.41	0.05	0.35	-	-
2023 Acasxu	70	SAT	0.02	< 0.01	0.47	0.17	0.23	-	-
2023 Acasxu	71	SAT	0.06	< 0.01	0.46	0.05	0.22	3.25	-
2023 Acasxu	72	SAT	0.06	< 0.01	0.52	0.16	0.23	-	-
2023 Acasxu 2023 Acasxu	$\frac{73}{74}$	UNSAT	52.8	- <0.01	0.48	$47.4 \\ 0.05$	4.73	9 99	-
2023 Acasxu 2023 Acasxu	75	SAT SAT	$0.01 \\ 0.07$	<0.01	0.48	0.05	0.22 0.27	3.33 2.01	-
2023 Acasxu	76	SAT	0.06	< 0.01	0.19	0.08	0.22	-	_
2023 Acasxu	77	SAT	0.06	< 0.01	0.51	0.05	0.23	3.33	-
2023 Acasxu	78	SAT	0.02	< 0.01	0.41	0.04	0.22	1.66	-
2023 Acasxu	79	SAT	0.09	< 0.01	0.45	0.04	0.22	2.08	-
2023 Acasxu	80	SAT	0.07	< 0.01	0.66	4.12	0.23	-	-
2023 Acasxu 2023 Acasxu	81 82	SAT SAT	$0.03 \\ 0.06$	<0.01	0.43	$0.06 \\ 0.03$	$0.22 \\ 0.22$	-	-
2023 Acasxu	83	SAT	24.2	83.5	-	-	0.83	_	_
2023 Acasxu	84	SAT	< 0.01		0.56	0.10	0.22	_	_
2023 Acasxu	85	SAT	0.06	< 0.01	0.47	0.05	0.21	3.08	-
2023 Acasxu	86	SAT	0.06	< 0.01	0.44	0.03	0.23	1.83	-
2023 Acasxu	87	SAT	0.04	< 0.01	0.44	0.05	0.22	1.38	-
2023 Acasxu	88	SAT	0.06	< 0.01	0.54	0.16	0.22	1.78	-
2023 Acasxu 2023 Acasxu	89 90	SAT UNSAT	0.07 13.7	< 0.01 17.3	$0.27 \\ 75.5$	0.04 7.88	$0.22 \\ 0.57$	1.50	-
2023 Acasxu 2023 Acasxu	91	UNSAT	2.18	9.03	3.28	3.26	0.55	_	-
2023 Acasxu	92	UNSAT	3.03	14.1	5.10	3.50	0.44	-	_
2023 Acasxu	93	UNSAT	1.49	7.02	0.71	3.01	0.24	6.70	-
2023 Acasxu	94	UNSAT	1.26	7.02	1.05	2.29	0.28	5.18	-
2023 Acasxu	95	UNSAT	0.69	6.01	0.21	1.73	0.20	4.81	-
2023 Acasxu	96	SAT	0.06	< 0.01	0.15	0.06	0.21	1.82	-
2023 Acasxu 2023 Acasxu	97 98	SAT SAT	$0.05 \\ 0.08$	<0.01	0.17 0.16	0.04 < 0.01	0.22 0.21	1.93 2.04	-
2023 Acasxu	99	UNSAT	2.40	8.03	2.46	3.25	0.43	-	_
2023 Acasxu		UNSAT	2.29	8.02	2.88	3.23	0.36	-	-
2023 Acasxu	101	UNSAT	2.12	8.02	2.45	3.15	0.42	-	-
2023 Acasxu			0.62	6.01	0.17	1.75	0.02	6.07	-
2023 Acasxu		UNSAT	1.53	7.02	0.61	2.51	0.22	5.37	-
2023 Acasxu 2023 Acasxu		UNSAT UNSAT	0.65 0.64	6.02	0.17 0.23	1.74 1.80	$0.22 \\ 0.22$	5.20 5.58	-
2023 Acasxu		UNSAT	0.65	6.02	0.23	1.75	0.24	4.47	-
2023 Acasxu		UNSAT	0.66	6.01	0.18	1.78	0.01	3.87	_
2023 Acasxu		UNSAT	1.52	7.02	0.86	2.99	0.22	5.29	-
2023 Acasxu	109	UNSAT	1.63	8.03	1.45	3.12	0.51	-	-
2023 Acasxu		UNSAT	1.53	7.02	1.36	3.08	0.38	6.90	-
2023 Acasxu		UNSAT	1.99	7.02	0.73	3.00	0.26	99.1	-
2023 Acasxu 2023 Acasxu		UNSAT UNSAT	1.24 1.57	7.02 7.02	$0.56 \\ 0.82$	2.26 2.99	0.23 0.24	5.87 91.7	-
2023 Acasxu		UNSAT	0.63	7.02	0.19	1.76	0.20	4.99	_
2023 Acasxu		UNSAT	1.19	7.02	0.53	2.29	0.22	5.23	-
2023 Acasxu	116	UNSAT	1.32	7.02	0.81	2.30	0.21	4.62	-
2023 Acasxu		UNSAT		8.04	2.09	2.79	0.24	94.6	-
2023 Acasxu		UNSAT		10.0	3.00	3.23	0.51	-	-
2023 Acasxu		UNSAT UNSAT		8.03	2.14	3.22	0.59	- 6 79	-
2023 Acasxu 2023 Acasxu		UNSAT		7.02 7.02	0.65 0.19	2.96 2.06	$0.22 \\ 0.21$	$6.72 \\ 4.54$	-
2023 Acasxu		UNSAT		7.02	0.77	3.03	0.22	7.12	_
2023 Acasxu		UNSAT		7.02	0.62	3.00	0.22	4.94	-
2023 Acasxu	124	UNSAT	0.63	7.02	0.21	1.75	0.27	5.02	-
2023 Acasxu		UNSAT		7.02	0.76	2.99	0.23	5.06	-
2023 Acasxu		UNSAT		9.04	3.53	3.30	0.42	-	-
2023 Acasxu 2023 Acasxu		UNSAT		7.02	1.33	2.79	0.25	5.65	-
2023 Acasxu 2023 Acasxu		UNSAT UNSAT		7.03 7.02	$0.89 \\ 0.50$	2.56 2.53	$0.25 \\ 0.21$	4.99 4.68	-
2023 Acasxu		UNSAT		7.02	0.65	2.98	0.21	5.16	_
2023 Acasxu		UNSAT		7.02	0.74	2.24	0.23	5.39	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Acasxu	132	UNSAT	0.94	7.02	0.19	2.05	< 0.01	3.89	_
2023 Acasxu	133	UNSAT	1.22	7.02	0.65	2.22	0.23	4.52	-
2023 Acasxu	134	UNSAT	1.54	7.02	0.29	2.97	< 0.01	3.36	-
2023 Acasxu	135	UNSAT	3.32	8.03	10.7	3.54	0.44	-	-
2023 Acasxu		UNSAT	2.60	8.03	2.74	3.60	0.43	-	-
2023 Acasxu			2.08	8.03	3.27	3.34	0.36	-	-
2023 Acasxu		UNSAT	1.54	7.02	0.92	3.09	0.22	76.5	-
2023 Acasxu		UNSAT	1.32	7.02	1.14	2.37	0.35	-	-
2023 Acasxu			1.23	7.03	0.95	2.32	0.29	5.76	-
2023 Acassu		SAT SAT	0.06	< 0.01	0.15	0.06	0.22 0.20	1.85	-
2023 Acasxu 2023 Acasxu		SAT	$0.05 \\ 0.08$	<0.01	0.19	0.06	0.20	1.29 1.42	-
2023 Acasxu 2023 Acasxu		UNSAT	1.54	7.02	0.22	3.01	0.27	-	_
2023 Acasxu	145		1.51	7.02	0.91	2.60	0.30	_	_
2023 Acasxu		UNSAT	1.23	7.02	0.90	2.28	0.22	5.40	_
2023 Acasxu		UNSAT	1.53	7.02	0.61	2.96	0.21	4.75	_
2023 Acasxu	148	UNSAT	1.55	7.02	0.66	2.59	0.24	5.17	_
2023 Acasxu		UNSAT	1.54	7.02	0.69	2.55	0.22	6.11	_
2023 Acasxu	150	UNSAT	1.47	7.02	0.50	2.50	0.22	4.97	_
2023 Acasxu		UNSAT	1.96	7.02	0.75	3.04	0.27	95.3	-
2023 Acasxu	152	UNSAT	0.69	6.01	0.20	1.78	0.01	4.31	-
2023 Acasxu	153	UNSAT	1.50	7.02	1.13	3.03	0.24	5.16	-
2023 Acasxu	154	UNSAT	1.54	7.03	0.91	2.61	0.29	4.77	-
2023 Acasxu	155	UNSAT	0.94	7.02	0.20	2.05	0.21	4.16	-
2023 Acasxu	156	UNSAT	1.22	7.03	0.57	2.21	0.21	4.53	-
2023 Acasxu	157	UNSAT	1.53	8.03	0.67	3.00	0.25	5.47	-
2023 Acasxu	158	UNSAT	1.95	7.03	0.67	3.01	0.22	6.12	-
2023 Acasxu		UNSAT	1.50	7.02	0.54	2.50	0.23	4.45	-
2023 Acasxu		UNSAT	1.55	7.02	0.86	2.59	0.29	72.1	-
2023 Acasxu		UNSAT	1.53	7.02	0.68	2.99	0.33	5.89	-
2023 Acasxu		UNSAT	0.69	7.02	0.21	1.78	0.21	4.17	-
2023 Acasxu 2023 Acasxu		UNSAT UNSAT	1.95	7.03 7.02	0.63 0.77	2.98 2.55	0.23 0.23	5.28 4.97	-
2023 Acasxu 2023 Acasxu		UNSAT	1.50 1.51	7.02	0.64	3.00	0.23 0.24	80.9	-
2023 Acasxu 2023 Acasxu			1.52	7.02	0.51	2.54	0.24	6.81	-
2023 Acasxu	167		1.52	7.02	0.50	2.52	0.21	5.02	_
2023 Acasxu	168	UNSAT	1.26	7.02	0.75	2.28	0.21	5.45	_
2023 Acasxu			1.52	7.03	0.63	2.99	0.22	5.56	-
2023 Acasxu		UNSAT	1.50	7.03	0.54	2.54	0.22	4.82	_
2023 Acasxu	171	UNSAT	1.49	7.02	0.54	3.01	0.22	4.99	-
2023 Acasxu	172	UNSAT	1.53	7.02	0.50	2.92	0.21	4.49	-
2023 Acasxu	173	UNSAT	1.52	7.02	0.65	2.96	0.23	4.63	-
2023 Acasxu	174	UNSAT	1.17	7.02	0.51	2.24	0.23	4.52	-
2023 Acasxu	175	UNSAT	1.60	7.02	0.59	2.98	0.22	5.34	-
2023 Acasxu		UNSAT	0.65	7.02	0.22	1.75	0.23	4.66	-
2023 Acasxu	177		0.95	7.02	0.21	2.06	0.22	5.01	-
2023 Acasxu	178	UNSAT	1.50	7.02	0.68	2.54	0.22	5.73	-
2023 Acasxu	179	UNSAT	1.23	7.02	0.56	2.25	0.22	5.00	-
2023 Acasxu 2023 Acasxu	180	UNSAT UNSAT	22.1 14.3	-	81.4 30.2	9.82 3.34	$0.95 \\ 3.74$	-	-
2023 Acasxu 2023 Acasxu		SAT	1.90	62.7	-	5.16	30.6	_	-
2023 Acasxu 2023 Acasxu		SAT	0.06	< 0.01	3.30	4.46	0.27	-	-
2023 Acasxu 2023 Acasxu		UNSAT		106	16.6	4.55	2.05	_	_
2023 Acasxu		UNSAT	5.68	24.1	3.43	3.57	0.64	-	-
2023 Cgan	0	SAT	1.73	< 0.01	2.75	0.52	9.98	2.37	-
2023 Cgan	$\frac{1}{2}$	SAT	1.70	< 0.01	0.35	0.47	31.1	2.42	
2023 Cgan 2023 Cgan	3	SAT UNSAT	1.72	<0.01	2.28 10.6	$0.46 \\ 16.4$	13.7 24.9	2.13	-
2023 Cgan 2023 Cgan	3 4	SAT	1.72	< 0.01	1.76	0.45	10.2	2.14	-
2023 Cgan 2023 Cgan	5	UNSAT		- 0.01	13.1	810	53.8	2.14	-
2023 Cgan	6	SAT	1.70	< 0.01	0.21	0.42	0.94	2.46	-
2023 Cgan 2023 Cgan	7	SAT	1.75	< 0.01	0.30	0.45	14.7	2.08	_
2023 Cgan 2023 Cgan	8	UNSAT	13.6	-	71.6	-	159	-	-
2023 Cgan	9	UNSAT		-	21.4	-	39.4	98.1	-
2023 Cgan	10	SAT	1.69	0.01	0.26	0.46	0.95	2.47	_
2023 Cgan	11	SAT	1.74	< 0.01	0.23	0.44	0.87	2.64	_
2023 Cgan	12	UNSAT		-	19.5	-	30.0	28.0	-
2023 Cgan	13	UNSAT		-	48.2	-	57.1	137	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Cgan	14	SAT	1.72	< 0.01	0.24	0.47	1.30	2.15	-
2023 Cgan	15	SAT	1.75	< 0.01	0.26	0.48	55.6	2.33	_
2023 Cgan	16	UNSAT	5.89	-	10.5	22.3	-	-	-
2023 Cgan	17	SAT	1.73	< 0.01	0.24	0.43	7.89	2.15	-
2023 Cgan	18	UNSAT	5.07	-	9.25	-	-	-	-
2023 Cgan	19	SAT	9.44	1.01	-	-	-	-	-
2023 Cgan	20	SAT	9.39	1.01	-	-	-	-	-
2023 Collins Rul Cnn	0	SAT	1.50	0.01	0.43	0.47	0.71	3.83	-
2023 Collins Rul Cnn 2023 Collins Rul Cnn	$\frac{1}{2}$	SAT UNSAT	1.53 3.13	$< 0.01 \\ 8.02$	$0.46 \\ 0.81$	3.34 1.78	0.75 0.68	0.83 2.25	-
2023 Collins Rul Cnn	3		3.10	7.02	0.81	1.75	0.76	1.78	-
2023 Collins Rul Cnn	4	SAT	1.54	< 0.01	0.46	3.32	0.68	0.57	-
2023 Collins Rul Cnn	5	UNSAT	3.14	9.13	0.80	1.96	0.75	2.47	-
2023 Collins Rul Cnn	6	SAT	1.50	< 0.01	0.44	3.36	0.87	0.80	-
2023 Collins Rul Cnn	7	UNSAT	3.25	10.1	0.82	1.93	0.70	2.45	-
2023 Collins Rul Cnn	8	UNSAT	3.09	8.03	0.82	1.76	0.77	2.18	-
2023 Collins Rul Cnn	9	UNSAT		7.02	0.80	1.76	0.75	2.12	-
2023 Collins Rul Cnn	10	SAT	1.52	< 0.01	0.44	0.44	0.69	0.62	-
2023 Collins Rul Cnn	11	SAT	1.54	< 0.01	0.47	0.42	0.73	0.81	-
2023 Collins Rul Cnn	12	UNSAT	3.08	10.1	0.83	1.75	0.74	2.82	-
2023 Collins Rul Cnn 2023 Collins Rul Cnn	$\frac{13}{14}$	UNSAT UNSAT	3.12 3.27	9.04 10.2	0.81	1.78 1.91	$0.76 \\ 0.70$	3.22 3.36	-
2023 Collins Rul Cnn	15		3.15	9.11	0.84	1.95	0.74	3.35	-
2023 Collins Rul Cnn	16	UNSAT	3.15	7.02	0.90	1.76	0.73	3.29	_
2023 Collins Rul Cnn	17	SAT	1.52	< 0.01	0.51	4.55	0.71	1.33	_
2023 Collins Rul Cnn	18	UNSAT	3.09	7.02	0.81	1.77	0.70	2.00	-
2023 Collins Rul Cnn	19	SAT	1.57	< 0.01	0.45	0.42	7.39	1.02	-
2023 Collins Rul Cnn	20	SAT	1.53	< 0.01	0.44	0.44	0.77	0.65	-
2023 Collins Rul Cnn	21	SAT	1.53	< 0.01	0.45	0.48	0.76	0.91	-
2023 Collins Rul Cnn	22	SAT	1.56	< 0.01	0.44	0.45	0.73	1.21	-
2023 Collins Rul Cnn	23	SAT	1.55	< 0.01	0.46	4.20	0.79	0.95	-
2023 Collins Rul Cnn	24	UNSAT	3.09	10.0	0.83	1.81	0.72	2.35	-
2023 Collins Rul Cnn 2023 Collins Rul Cnn	$\frac{25}{26}$	UNSAT UNSAT	3.22 3.25	10.0 14.1	0.84 0.85	1.77 1.96	0.68 0.78	2.56 2.44	-
2023 Collins Rul Cnn	27		3.16	10.0	0.83	1.94	0.75	2.63	-
2023 Collins Rul Cnn	28	SAT	1.53	< 0.01	0.44	3.73	0.73	0.68	_
2023 Collins Rul Cnn	29	SAT	1.55	< 0.01	0.46	0.42	0.72	0.82	-
2023 Collins Rul Cnn	30	UNSAT	3.24	10.0	0.86	1.78	0.77	2.88	-
2023 Collins Rul Cnn	31	UNSAT	3.09	10.0	0.86	1.82	0.79	2.83	-
2023 Collins Rul Cnn	32	SAT	1.54	< 0.01	0.43	0.42	0.83	1.60	-
2023 Collins Rul Cnn	33	SAT	1.57	< 0.01	0.44	0.43	0.78	1.40	-
2023 Collins Rul Cnn	34	SAT	1.57	< 0.01	0.53	3.32	0.73	1.29	-
2023 Collins Rul Cnn	35	UNSAT		14.3	0.85	1.82	0.70	2.88	-
2023 Collins Rul Cnn 2023 Collins Rul Cnn	$\frac{36}{37}$	UNSAT UNSAT	$3.28 \\ 3.14$	15.2 15.2	$0.88 \\ 0.85$	1.92 1.96	0.93 0.73	2.81 3.08	-
2023 Collins Rul Cnn	38	UNSAT	3.07	10.0	0.92	1.77	0.68	2.30	-
2023 Collins Rul Cnn	39	SAT	1.57	< 0.01	0.46	4.53	0.78	0.63	_
2023 Collins Rul Cnn	40	UNSAT		10.0	0.88	1.77	0.70	2.55	_
2023 Collins Rul Cnn	41	SAT	1.54	< 0.01	0.44	0.42	0.78	0.81	-
2023 Collins Rul Cnn	42	SAT	1.55	< 0.01	0.44	0.41	0.70	0.71	-
2023 Collins Rul Cnn	43	UNSAT	3.44	48.8	1.52	1.97	0.82	-	-
2023 Collins Rul Cnn	44	SAT	1.56	< 0.01	0.44	0.42	1.09	0.82	-
2023 Collins Rul Cnn	45	UNSAT	3.47	51.9	1.51	1.79	0.74	-	-
2023 Collins Rul Cnn	46	SAT	1.57	< 0.01	0.49	0.44	0.79	0.95	-
2023 Collins Rul Cnn 2023 Collins Rul Cnn	$\frac{47}{48}$	UNSAT UNSAT	3.48	47.0 48.9	1.50 1.53	1.94	0.95	-	-
2023 Collins Rul Chn 2023 Collins Rul Cnn	49	UNSAT		49.8	1.48	1.92 1.98	$0.85 \\ 0.72$	-	-
2023 Collins Rul Cnn	50	SAT	1.52	< 0.01	0.45	0.47	0.75	1.12	-
2023 Collins Rul Cnn	51	SAT	1.55	< 0.01	0.45	0.45	0.74	0.85	-
2023 Collins Rul Cnn	52	UNSAT	3.50	49.9	1.54	1.84	0.76	-	-
2023 Collins Rul Cnn	53	UNSAT		46.9	1.58	1.95	0.93	-	-
2023 Collins Rul Cnn	54	SAT	1.61	< 0.01	0.46	0.45	3.51	0.92	-
2023 Collins Rul Cnn	55	UNSAT	3.50	52.9	1.57	1.93	0.81	-	-
2023 Collins Rul Cnn	56	UNSAT		50.8	1.57	1.96	1.03	-	-
2023 Collins Rul Cnn	57	SAT	1.54	< 0.01	0.47	0.42	0.74	0.86	-
2023 Collins Rul Cnn	58	SAT	1.58	< 0.01	0.46	0.44	0.88	0.91	-
2023 Collins Rul Cnn 2023 Collins Rul Cnn	59 60	UNSAT		47.8 50.0	-	1.93	0.90	-	-
2023 Comms Rui Cim	00	UNSAT	5.50	50.0	-	1.96	1.14	-	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Collins Rul Cnn	61	UNSAT	3.52	46.7	1.62	1.95	0.79	-	-
2023 Dist Shift	0	UNSAT	0.93	10.0	0.72	1.85	-	-	_
2023 Dist Shift	1	UNSAT	1.50	-	0.74	2.25	-	-	-
2023 Dist Shift	2	UNSAT	0.97	13.1	0.73	1.61	-	-	-
2023 Dist Shift	3	UNSAT	1.01	63.4	6.85	1.68	-	-	-
2023 Dist Shift	4	UNSAT		78.6	3.48	2.34	-	-	-
2023 Dist Shift 2023 Dist Shift	5 6	UNSAT UNSAT	$0.98 \\ 4.73$	8.03	0.71 9.33	1.67 2.47	_	_	_
2023 Dist Shift	7	SAT	0.06	< 0.01	0.50	0.02	-	1.09	_
2023 Dist Shift	8	UNSAT	3.03	-	1.65	2.27	-	-	-
2023 Dist Shift	9	UNSAT	3.03	-	4.98	2.31	-	-	-
2023 Dist Shift	10		1.02	13.1	0.70	1.66	-	-	-
2023 Dist Shift	11	UNSAT	0.97	8.03	0.71	1.63	-	-	-
2023 Dist Shift 2023 Dist Shift	12 13	UNSAT UNSAT	1.58 0.96	102 8.03	0.70	2.29 1.69	_	_	-
2023 Dist Shift	14	UNSAT	3.05	8.03	1.26	2.33	_	_	_
2023 Dist Shift	15	UNSAT	1.47	9.04	1.68	2.30	-	-	-
2023 Dist Shift	16	UNSAT	0.96	8.02	0.71	1.64	-	-	-
2023 Dist Shift	17	UNSAT	0.97	8.03	0.71	1.61	-	-	-
2023 Dist Shift	18	UNSAT		8.02	0.73	1.64	-	-	-
2023 Dist Shift 2023 Dist Shift	19	UNSAT		8.03	0.72	1.66	-	-	-
2023 Dist Shift 2023 Dist Shift	$\frac{20}{21}$	UNSAT UNSAT	1.59	117 8.03	1.30 0.70	2.26 1.63	-	_	_
2023 Dist Shift 2023 Dist Shift	22	SAT	0.01	< 0.01	1.21	< 0.01	-	1.25	_
2023 Dist Shift	23	UNSAT		8.02	0.78	1.63	-	-	-
2023 Dist Shift	24	UNSAT	1.00	8.03	0.69	1.65	-	-	-
2023 Dist Shift	25	UNSAT	0.96	8.03	0.73	1.66	-	-	-
2023 Dist Shift	26		3.93	-	1.63	2.32	-	-	-
2023 Dist Shift	27	UNSAT	12.4	-	- 0.00	1 01	-	-	-
2023 Dist Shift 2023 Dist Shift	$\frac{28}{29}$	UNSAT		8.03 105	0.69	1.61 2.25	-	-	-
2023 Dist Shift 2023 Dist Shift	30	UNSAT UNSAT	1.71 3.03	-	0.72 7.07	2.33	_	_	-
2023 Dist Shift	31		1.61	42.3	2.07	2.29	-	_	_
2023 Dist Shift	32		2.97	-	1.37	2.28	-	-	-
2023 Dist Shift	33	UNSAT	3.05	121	1.69	2.30	-	-	-
2023 Dist Shift	34	UNSAT		10.0	0.70	1.67	-	-	-
2023 Dist Shift	35	UNSAT	1.50	80.5	0.73	2.30	-	-	-
2023 Dist Shift 2023 Dist Shift	$\frac{36}{37}$	UNSAT UNSAT	3.03	134 9.03	2.73 1.39	2.31 2.28	_	-	-
2023 Dist Shift 2023 Dist Shift	38	UNSAT		8.03	0.69	1.64	_	_	-
2023 Dist Shift	39	UNSAT	0.97	9.04	0.74	1.66	-	-	-
2023 Dist Shift	40	UNSAT	0.96	9.03	1.87	1.67	-	-	-
2023 Dist Shift	41	UNSAT	0.99	8.03	0.77	1.63	-	-	-
2023 Dist Shift	42	UNSAT	0.97	8.03	0.71	1.68	-	-	-
2023 Dist Shift	43	SAT	0.03	< 0.01	0.51	0.04	-	0.94	-
2023 Dist Shift 2023 Dist Shift	$\frac{44}{45}$	SAT UNSAT	0.09 3.06	<0.01	$0.50 \\ 0.72$	0.03 2.28	-	1.06	-
2023 Dist Shift	46	UNSAT		8.03	0.72	1.66	_	_	_
2023 Dist Shift	47		1.72	8.03	0.71	2.29	-	_	-
2023 Dist Shift	48	UNSAT	0.94	8.03	0.69	1.65	-	-	-
2023 Dist Shift	49	UNSAT	1.74	159	0.70	2.26	-	-	-
2023 Dist Shift	50	UNSAT		8.03	0.77	1.67	-	-	-
2023 Dist Shift	51	UNSAT		8.03	0.70	1.62	-	-	-
2023 Dist Shift 2023 Dist Shift	52 53	UNSAT UNSAT		8.03 8.03	0.71 0.69	1.64 1.64	-	_	_
2023 Dist Shift 2023 Dist Shift	54	SAT	0.08	2.02	142	0.39	_	_	-
2023 Dist Shift	55	UNSAT		8.03	0.71	1.66	-	-	-
2023 Dist Shift	56	UNSAT		-	4.41	2.36	-	-	-
2023 Dist Shift	57		1.48	14.1	1.34	2.27	-	-	-
2023 Dist Shift	58	UNSAT		8.03	0.70	1.64	-	-	-
2023 Dist Shift	59	UNSAT		8.03	0.71	1.64	-	-	-
2023 Dist Shift 2023 Dist Shift	60 61	UNSAT UNSAT		8.03	0.71	1.68	-	-	-
2023 Dist Shift 2023 Dist Shift	62	UNSAT		8.03 46.3	0.69 0.70	1.65 2.31	_	-	-
2023 Dist Shift 2023 Dist Shift	63	UNSAT		16.1	0.72	2.28	-	_	-
2023 Dist Shift	64	UNSAT		16.1	10.2	2.31	-	-	-
2023 Dist Shift	65	UNSAT	1.86	13.1	2.82	3.19	-	-	-
2023 Dist Shift	66	UNSAT	9.61	-	23.5	3.46	-	-	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Dist Shift	67		0.97	8.03	0.71	1.65	-	-	-
2023 Dist Shift	68	UNSAT		11.0	0.68	1.68	-	-	-
2023 Dist Shift 2023 Dist Shift	69 70	UNSAT UNSAT	5.35 0.92	8.02	38.1 0.70	3.41	-	-	-
2023 Dist Shift 2023 Dist Shift	71	UNSAT	1.42	12.1	0.70	2.29	_	_	-
2023 Ml4acopf 2023 Ml4acopf	0 1	UNSAT	29.0	_	-	_	-	-	-
2023 Ml4acopf	2	?	_	_	-	-	-	_	-
2023 Ml4acopf	3	UNSAT	2.22	-	-	-	-	-	-
2023 Ml4acopf	4	UNSAT	2.30	-	-	-	-	-	-
2023 Ml4acopf	5	UNSAT	2.15	-	-	-	-	-	-
2023 Ml4acopf 2023 Ml4acopf	6 7	UNSAT UNSAT	2.17 2.60	_	-	_	_	_	-
2023 Ml4acopf	8	UNSAT		-	-	-	-	-	-
2023 Ml4acopf	9	UNSAT	2.18	-	-	-	-	-	-
2023 Ml4acopf	10	UNSAT	2.12	-	-	-	-	-	-
2023 Ml4acopf	11	UNSAT		_	-	_	-	-	-
2023 Ml4acopf 2023 Ml4acopf	$\frac{12}{13}$	UNSAT UNSAT	2.16	-	_	_	_	-	-
2023 Ml4acopf	14	UNSAT	2.19	_	_	_	_	_	-
2023 Ml4acopf	15		7.92	-	-	-	-	-	-
2023 Ml4acopf	16	UNSAT	2.19	-	-	-	-	-	-
2023 Ml4acopf	17	UNSAT		-	-	-	-	-	-
2023 Ml4acopf 2023 Ml4acopf	18 19	UNSAT	2.10	_	-	_	_	-	-
2023 Ml4acopf	20	UNSAT	2.48	_	_	_	_	_	-
2023 Ml4acopf	21	SAT	0.66	-	-	-	-	-	-
2023 Ml4acopf	22	?	-	-	-	-	-	-	-
2023 Nn4sys	0	UNSAT	2.36	7.02	0.18	4.36	-	-	-
2023 Nn4sys	1	UNSAT	2.34	7.02	0.35	3.55	-	-	-
2023 Nn4sys	2	UNSAT	0.81	7.02	0.28	3.10	-	-	-
2023 Nn4sys	3 4		2.42	7.02	0.23	3.55	-	-	-
2023 Nn4sys 2023 Nn4sys	5	UNSAT UNSAT	0.82 1.90	7.02	0.19	3.10 4.83	_	_	-
2023 Nn4sys	6		3.88	-	-	-	-	-	-
2023 Nn4sys	7	UNSAT	2.37	7.02	0.27	3.62	-	-	-
2023 Nn4sys	8	UNSAT	3.92	-	-	- 0.10	-	-	-
2023 Nn4sys 2023 Nn4sys	9 10	UNSAT UNSAT	$0.82 \\ 3.92$	7.02	0.23	3.10	_	-	-
2023 Nn4sys	11		2.37	7.02	0.25	3.59	_	_	_
2023 Nn4sys	12		0.83	7.02	0.14	3.10	-	_	_
2023 Nn4sys	13	UNSAT	0.84	7.02	0.16	3.05	-	-	-
2023 Nn4sys	14	UNSAT	3.87	-	- 0.15	5.54	-	-	-
2023 Nn4sys 2023 Nn4sys	15 16	UNSAT	0.83 3.91	7.02	0.15	3.08	-	_	-
2023 Nn4sys 2023 Nn4sys	17	UNSAT UNSAT	2.34	7.02	0.27	3.60	_	_	-
2023 Nn4sys	18		0.84	7.02	0.20	3.08	-	-	-
2023 Nn4sys	19	UNSAT		7.02	0.23	3.09	-	-	-
2023 Nn4sys	20	UNSAT	0.83	7.02	0.23	3.06	-	-	-
2023 Nn4sys 2023 Nn4sys	$\frac{21}{22}$	UNSAT UNSAT	2.36 0.85	8.03 7.02	0.24 0.14	3.83	_	-	-
2023 Nn4sys 2023 Nn4sys	23	UNSAT		-	-	5.09 -	_	_	_
2023 Nn4sys	24	UNSAT		-	-	4.81	-	-	-
2023 Nn4sys	25	UNSAT		7.02	0.17	3.57	-	-	-
2023 Nn4sys	26	UNSAT		7.02	0.17	5.57	-	-	-
2023 Nn4sys 2023 Nn4sys	$\frac{27}{28}$	UNSAT UNSAT		7.02	0.17	3.55 4.85	-	-	-
2023 Nn4sys 2023 Nn4sys	29	UNSAT		7.02	0.17	3.09	_	_	-
2023 Nn4sys	30	UNSAT		7.02	0.16	3.07	-	-	-
2023 Nn4sys	31	UNSAT	2.45	7.02	0.25	3.58	-	-	-
2023 Nn4sys	32	UNSAT		8.03	0.24	3.88	-	-	-
2023 Nn4sys 2023 Nn4sys	$\frac{33}{34}$	UNSAT UNSAT		8.03 8.03	$0.32 \\ 0.21$	3.83	-	-	_
2023 Nn4sys 2023 Nn4sys	$\frac{34}{35}$	UNSAT		-	0.21	ə.oə -	_	-	-
2023 Nn4sys	36		6.11	-	-	-	-	-	-
2023 Nn4sys	37	UNSAT		-	-	-	-	-	-
2023 Nn4sys	38	UNSAT	6.27	-	-	-	-	-	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Nn4sys	39	UNSAT		-	-	-	-	-	-
2023 Nn4sys	40	UNSAT		-	-	-	-	-	-
2023 Nn4sys	41	UNSAT		-	-	-	-	-	-
2023 Nn4sys	42	UNSAT	6.40	-	-	-	-	-	-
2023 Nn4sys	43 44	UNSAT		-	_	_	-	-	-
2023 Nn4sys 2023 Nn4sys	45	UNSAT UNSAT		_	_	_	_	_	_
2023 Nn4sys 2023 Nn4sys	46	UNSAT		_	_	_	_	_	_
2023 Nn4sys	47	UNSAT		_	_	_	_	_	_
2023 Nn4sys	48	UNSAT		_	_	_	_	_	_
2023 Nn4sys	49	UNSAT		_	_	_	_	-	-
2023 Nn4sys	50	UNSAT		_	_	_	_	_	_
2023 Nn4sys	51		6.67	-	-	-	-	-	-
2023 Nn4sys	52	UNSAT	6.22	-	-	-	-	-	-
2023 Nn4sys	53	UNSAT	6.44	-	-	-	-	-	-
2023 Nn4sys	54	UNSAT	6.68	-	-	-	-	-	-
2023 Nn4sys	55	UNSAT	6.25	-	-	-	-	-	-
2023 Nn4sys	56	UNSAT		-	-	-	-	-	-
2023 Nn4sys	57	UNSAT	6.16	-	-	-	-	-	-
2023 Nn4sys	58	UNSAT	6.18	-	-	-	-	-	-
2023 Nn4sys	59	UNSAT	6.25	-	-	-	-	-	-
2023 Nn4sys	60	UNSAT		-	-	-	-	-	-
2023 Nn4sys	61	UNSAT		-	-	-	-	-	-
2023 Nn4sys	62	UNSAT		-	-	-	-	-	-
2023 Nn4sys	63	UNSAT		-	-	-	-	-	-
2023 Nn4sys	64	UNSAT		-	-	-	-	-	-
2023 Nn4sys	65	UNSAT		-	-	-	-	-	-
2023 Nn4sys	66	UNSAT		-	-	-	-	-	-
2023 Nn4sys	67	UNSAT		-	-	-	-	-	-
2023 Nn4sys	68	UNSAT		-	-	-	-	-	-
2023 Nn4sys	69	UNSAT		-	-	-	-	-	-
2023 Nn4sys	70 71	UNSAT		-	-	-	-	-	-
2023 Nn4sys	$\frac{71}{72}$	UNSAT UNSAT	6.77	-	-	_	-	-	-
2023 Nn4sys 2023 Nn4sys	73	UNSAT		_	_	_	_	_	_
2023 Nn4sys 2023 Nn4sys	74		6.48	_	-	_	_	_	_
2023 Nn4sys	75	UNSAT		_	_	_	_	_	_
2023 Nn4sys	76	UNSAT		_	_	_	_	_	_
2023 Nn4sys	77	UNSAT		_	_	_	_	_	_
2023 Nn4sys	78	UNSAT		_	_	_	_	_	_
2023 Nn4sys	79	UNSAT	7.31	-	_	-	-	-	-
2023 Nn4sys	80	UNSAT	6.69	-	-	-	-	-	-
2023 Nn4sys	81	UNSAT	6.72	-	-	-	-	-	-
2023 Nn4sys	82	UNSAT	6.47	-	-	-	-	-	-
2023 Nn4sys	83	UNSAT	6.94	-	-	-	-	-	-
2023 Nn4sys	84	UNSAT	6.75	-	-	-	-	-	-
2023 Nn4sys	85	UNSAT	6.77	-	-	-	-	-	-
2023 Nn4sys	86	UNSAT	6.71	-	-	-	-	-	-
2023 Nn4sys	87	UNSAT	6.65	-	-	-	-	-	-
2023 Nn4sys	88	UNSAT		-	-	-	-	-	-
2023 Nn4sys	89		6.64	-	-	-	-	-	-
2023 Nn4sys	90		6.61	-	-	-	-	-	-
2023 Nn4sys	91	UNSAT		-	-	-	-	-	-
2023 Nn4sys	92	UNSAT		-	-	-	-	-	-
2023 Nn4sys	93	UNSAT		-	-	-	-	-	-
2023 Nn4sys	94	UNSAT		-	-	-	-	-	-
2023 Nn4sys	95	UNSAT		_	_	_	-	-	-
2023 Nn4sys	96	UNSAT		-					
2023 Nn4sys 2023 Nn4sys	97 98	UNSAT UNSAT		_	_	_	-	-	-
2023 Nn4sys 2023 Nn4sys	98 99	UNSAT		_	_	-	_	_	-
2023 Nn4sys 2023 Nn4sys		UNSAT		_	-	_	_	_	-
2023 Nn4sys 2023 Nn4sys		UNSAT		_	_	_	_	_	_
2023 Nn4sys 2023 Nn4sys		UNSAT		_	_	_	-	_	_
2023 Nn4sys 2023 Nn4sys		UNSAT		_	_	_	_	_	_
2023 Nn4sys		UNSAT		_	_	_	_	_	_
2023 Nn4sys		UNSAT		6.02	0.36	1.55	0.02	_	_
2023 Nn4sys		UNSAT		7.02	0.35	1.58	0.03	-	-
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Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Nn4sys	107	UNSAT	0.29	21.1	13.3	1.07	0.43	×	-
2023 Nn4sys	108	UNSAT	0.22	44.3	16.2	1.56	0.52	X	-
2023 Nn4sys	109	UNSAT	0.24	36.2	24.8	1.47	0.83	X	-
2023 Nn4sys	110	UNSAT	0.24	81.5	31.1	1.69	0.93	X	-
2023 Nn4sys	111	UNSAT	0.22	50.3	39.1	2.42	1.22	X	-
2023 Nn4sys	112	UNSAT	0.28	-	48.3	2.34	1.37	X	-
2023 Nn4sys	113	UNSAT	0.22	65.4	51.4	1.78	1.61	X	-
2023 Nn4sys	114	UNSAT	0.29	-	63.0	2.67	1.78	X	-
2023 Nn4sys	115	SAT	X	X	X	X	X	4.08	-
2023 Nn4sys	116	SAT	X	-	X	X	X	4.14	-
2023 Nn4sys	117	UNSAT	0.43	-	-	4.27	5.96	-	-
2023 Nn4sys	118	UNSAT	0.43	-	-	4.52	6.93	-	-
2023 Nn4sys	119	UNSAT	0.50	-	-	6.64	9.88	-	-
2023 Nn4sys	120	UNSAT	0.52	-	-	7.23	11.0	-	-
2023 Nn4sys	121	UNSAT	0.62	-	-	8.74	13.9	-	-
2023 Nn4sys	122	UNSAT	0.59	-	-	9.58	15.4	-	-
2023 Nn4sys	123	UNSAT	0.77	_	_	10.8	17.7	_	-
2023 Nn4sys	124	UNSAT	0.81	_	_	12.2	20.0	_	-
2023 Nn4sys	125	UNSAT	0.75	_	_	12.1	20.3	_	-
2023 Nn4sys		UNSAT		_	_	13.3	21.8	_	_
2023 Nn4sys		UNSAT		_	_	_	_	_	_
2023 Nn4sys		UNSAT		_	_	_	-	_	_
2023 Nn4sys		UNSAT		_	0.42	3.77	-	_	_
2023 Nn4sys		UNSAT		_	_	7.43	-	_	_
2023 Nn4sys		UNSAT		_	_	9.98	-	_	_
2023 Nn4sys		UNSAT		_	_	11.8	-	_	_
2023 Nn4sys	133	UNSAT	5.35	_	_	22.1	-	_	_
2023 Nn4sys		UNSAT		_	_	27.4	_	_	_
2023 Nn4sys		UNSAT		_	_	32.5	_	_	_
2023 Nn4sys		UNSAT		_	_	37.4	_	_	_
2023 Nn4sys		UNSAT		_	3.57	5.57	_	_	_
2023 Nn4sys		UNSAT		_	_	12.0	_	_	_
2023 Nn4sys	139			_	_	12.7	_	_	_
2023 Nn4sys		UNSAT		_	_	14.9	_	_	_
2023 Nn4sys		UNSAT		_	_	17.2	_	_	_
2023 Nn4sys		UNSAT		_	_	19.0	_	_	_
2023 Nn4sys		UNSAT		_	_	20.1	_	_	_
2023 Nn4sys		UNSAT		_	_	23.7	_	_	_
2023 Nn4sys		UNSAT		_	_	47.5	_	_	_
2023 Nn4sys		UNSAT		_	_	59.3	_	_	_
2023 Nn4sys		UNSAT		_	_	74.0	_	_	_
2023 Nn4sys		UNSAT		_	_	97.3	_	_	_
2023 Nn4sys		UNSAT		_	_	96.8	_	_	_
2023 Nn4sys		UNSAT		_	_	110	_	_	_
2023 Nn4sys		UNSAT		_	_	127	_	_	_
2023 Nn4sys		UNSAT			_	157	_		_
2023 Nn4sys 2023 Nn4sys		UNSAT		_	_	142	_	_	_
2023 Nn4sys		UNSAT		-	_	154	_	_	_
2023 Nn4sys 2023 Nn4sys	155			-	_	171	_	-	-
2023 Nn4sys 2023 Nn4sys		UNSAT		_	_	-	_	_	_
2023 Nn4sys 2023 Nn4sys	157				_	198	_	_	_
		UNSAT		-	-	190	-	-	-
2023 Nn4sys		UNSAT		-	_	259	-	_	-
2023 Nn4sys 2023 Nn4sys				-		6.32	-	_	-
		UNSAT		-	35.9	0.52	-	-	-
2023 Nn4sys		UNSAT		-	-	_	_	_	-
2023 Nn4sys		UNSAT		-	-	_			-
2023 Nn4sys				-	-	_	-	-	-
2023 Nn4sys		UNSAT		-	-				-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	8.69	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys	174	UNSAT	10.8	-	-	-	-	-	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Catagony	Tal	P 00:-14		Manal	D ₁ ,D ₀ ,±	NIC AT	NINIar	NINIX?	FootDom
Category					PyKat		ininen		FastBaT
2023 Nn4sys		UNSAT		-	-	-	-	-	-
2023 Nn4sys 2023 Nn4sys	177	UNSAT UNSAT	15.3 16.9	-	_	_	_	_	_
2023 Nn4sys 2023 Nn4sys	178		17.9	_	-	_	_	_	_
2023 Nn4sys		UNSAT	40.2	_	_	_	_	_	_
2023 Nn4sys		UNSAT	50.0	-	-	-	_	_	_
2023 Nn4sys		UNSAT	59.0	-	-	-	-	-	-
2023 Nn4sys	182	UNSAT	71.7	-	-	-	-	-	-
2023 Nn4sys	183	UNSAT	80.6	-	-	-	-	-	-
2023 Nn4sys		UNSAT	93.7	-	-	-	-	-	-
2023 Nn4sys		UNSAT	105	-	-	-	-	-	-
2023 Nn4sys		UNSAT	115	-	-	-	-	-	-
2023 Nn4sys		UNSAT UNSAT	127 134	-	_	_	-	-	-
2023 Nn4sys 2023 Nn4sys		UNSAT	144	_	_	_	_	_	_
2023 Nn4sys		UNSAT	157	_	-	_	_	_	_
2023 Nn4sys		UNSAT	166	_	_	_	_	_	_
2023 Nn4sys		UNSAT	176	_	_	_	_	_	_
2023 Nn4sys		UNSAT	188	-	-	-	-	-	-
2023 Tllverifybench	0	UNSAT	0.97	8.03	13.5	2.43	-	399	0.01
2023 Tllverifybench	1	UNSAT	1.04	7.03	7.68	2.46	1.51	-	0.15
2023 Tllverifybench	2	SAT	0.06	< 0.01	0.26	0.02	0.49	1.23	< 0.01
2023 Tllverifybench	3	UNSAT	0.97	7.02	6.49	2.43	1.52	-	0.11
2023 Tllverifybench	4	SAT	0.11	< 0.01	0.32	0.06	0.71	0.71	0.04
2023 Tllverifybench	5	SAT	0.37	< 0.01	-	0.19	0.96	0.21	0.19
2023 Tllverifybench	6	SAT	0.07	< 0.01	0.35	0.05	0.64	< 0.01	0.08
2023 Tllverifybench	7	SAT	0.09	< 0.01	0.32	0.03	0.80	0.09	0.07
2023 Tllverifybench	8	SAT	0.26	< 0.01	0.40	0.09	0.53	0.40	0.01
2023 Tllverifybench	9	UNSAT	1.82	20.2	26.7	2.93	-	-	0.08
2023 Tllverifybench 2023 Tllverifybench	10 11	UNSAT UNSAT	$1.47 \\ 3.24$	29.3	9.50 181	2.96 3.14	-	-	0.06
2023 Tilverifybench	12	SAT	0.66	< 0.01	-	0.23	1.71	1.50	0.01 0.22
2023 Tllverifybench	13	UNSAT	2.34	-	149	3.16	-	-	0.01
2023 Tllverifybench	14	UNSAT	1.87	-	48.0	3.09	_	_	0.16
2023 Tllverifybench	15	SAT	0.66	< 0.01	0.63	0.12	1.00	0.51	0.07
2023 Tllverifybench	16	SAT	1.64	< 0.01	1.10	0.36	3.34	0.93	0.09
2023 Tllverifybench	17	UNSAT	4.87	185	94.4	5.11	-	-	0.08
2023 Tllverifybench	18	UNSAT	10.9	-	-	5.50	-	-	0.02
2023 Tllverifybench	19	UNSAT	5.62	-	250	5.32	-	-	0.41
2023 Tllverifybench	20	SAT	3.28	< 0.01	-	0.73	7.47	0.74	0.45
2023 Tllverifybench	21	SAT	3.26	< 0.01	2.60	0.72	7.49	0.66	0.20
2023 Tllverifybench	22	UNSAT	9.03	- 0.01	1 01	7.03	- 5 01	1 11	< 0.01
2023 Tllverifybench 2023 Tllverifybench	23 24	SAT UNSAT	3.24 18.9	<0.01	1.81	0.74 44.9	5.21	1.11	0.02 0.03
2023 Tilverifybench	25	SAT	6.07	< 0.01	4.07	1.40	11.1	1.16	0.03
2023 Tllverifybench	26	SAT	6.22	< 0.01	3.67	1.40	11.3	0.95	0.03
2023 Tllverifybench	27	SAT	6.05	0.01	3.63	1.43	12.3	1.31	0.10
2023 Tllverifybench	28	UNSAT	16.6	-	-	70.0	-	-	0.27
2023 Tllverifybench	29	SAT	10.6	1.01	-	2.38	-	-	0.01
2023 Tllverifybench	30	SAT	10.2	1.02	-	2.39	25.1	1.99	0.54
2023 Tllverifybench	31	UNSAT	16.9	-	-	72.8	-	-	0.63
2023 Traffic Signs Recognition	0	SAT	1.90	0.01	1.01	-	-	-	-
2023 Traffic Signs Recognition	1	SAT	1.91	< 0.01	1.01	-	-	-	-
2023 Traffic Signs Recognition		SAT	1.91	< 0.01	0.95	-	-	-	-
2023 Traffic Signs Recognition		SAT	1.90	< 0.01	1.02	-	-	-	-
2023 Traffic Signs Recognition		SAT	1.91	0.01	0.94	-	-	-	-
2023 Traffic Signs Recognition		?	-	-	-	-	-	-	-
2023 Traffic Signs Recognition 2023 Traffic Signs Recognition		? sat	2 55	-	_	-	_	_	-
2023 Traffic Signs Recognition 2023 Traffic Signs Recognition		SAT SAT	2.55 2.28	-	-	_	_	_	-
2023 Traffic Signs Recognition		SAT	2.18	_	_	_	_	_	_
2023 Traffic Signs Recognition		SAT	2.24	-	_	0.83	-	_	_
2023 Traffic Signs Recognition		SAT	2.31	47.3	-	0.84	-	-	-
2023 Traffic Signs Recognition		SAT	2.22	7.06	-	0.86	-	-	-
2023 Traffic Signs Recognition		SAT	1.92	< 0.01	-	0.83	-	-	-
2023 Traffic Signs Recognition	14	SAT	1.94	< 0.01	-	0.84	-	-	-
2023 Traffic Signs Recognition	15	UNSAT	X	-	-	X	-	-	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α - β - \mathbf{C}	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Traffic Signs Recognition		SAT	2.42	_	-	1.47	-	<u> </u>	-
2023 Traffic Signs Recognition		SAT	2.34	-	-	1.47	-	-	-
2023 Traffic Signs Recognition	18	SAT	2.35	-	-	1.47	-	-	-
2023 Traffic Signs Recognition		SAT	2.36	276	-	1.46	-	-	-
2023 Traffic Signs Recognition 2023 Traffic Signs Recognition		SAT	2.50	-	-	1.42	_	-	-
2023 Traffic Signs Recognition		SAT UNSAT	2.33 X	_	_	1.46 X	_	_	-
2023 Traffic Signs Recognition		SAT	2.33	-	_	1.46	-	-	_
2023 Traffic Signs Recognition	24	SAT	2.33	-	-	1.48	-	-	-
2023 Traffic Signs Recognition		SAT	2.03	< 0.01	-	1.46	-	-	-
2023 Traffic Signs Recognition		SAT	2.04 2.05	<0.01 <0.01	3.67	1.46 1.45	_	-	-
2023 Traffic Signs Recognition 2023 Traffic Signs Recognition		SAT UNSAT	Z.05	X	×	X	_	_	-
2023 Traffic Signs Recognition		SAT	1.99	< 0.01	3.63	1.44	-	-	-
2023 Traffic Signs Recognition	30	SAT	2.63	-	-	2.45	-	-	-
2023 Traffic Signs Recognition		SAT	2.60	-	-	2.47	-	-	-
2023 Traffic Signs Recognition		SAT	2.59	-	-	2.33	_	-	-
2023 Traffic Signs Recognition 2023 Traffic Signs Recognition		SAT SAT	2.54 2.56	9.07	_	2.25 2.22	_	_	_
2023 Traffic Signs Recognition		UNSAT	-	-	_	X	_	_	_
2023 Traffic Signs Recognition		SAT	3.39	_	-	2.17	-	-	-
2023 Traffic Signs Recognition		SAT	3.04	-	-	2.16	-	-	-
2023 Traffic Signs Recognition		SAT	2.80	-	-	2.16	-	-	-
2023 Traffic Signs Recognition		SAT	2.63	-	-	2.18	-	-	-
2023 Traffic Signs Recognition 2023 Traffic Signs Recognition		SAT SAT	2.57 2.62	_	-	2.20 2.21	_	_	-
2023 Traffic Signs Recognition		SAT	2.59	121	_	2.18	_	_	_
2023 Traffic Signs Recognition		SAT	2.58	21.1	-	2.20	-	-	-
2023 Traffic Signs Recognition		SAT	2.21	1.01	-	2.18	-	-	-
2023 Vggnet16	0	UNSAT	9.46	30.5	63.1	50.9	33.2	-	-
2023 Vggnet16	1	UNSAT	9.41	211	63.1	51.0	29.7	-	-
2023 Vggnet16	2	UNSAT		-	68.2	- 50.0	33.0	-	-
2023 Vggnet16 2023 Vggnet16	3 4	UNSAT UNSAT	9.27	-	69.7 73.3	50.9	30.9 37.0	-	-
2023 Vggnet16	5		9.36	_	85.5	_	52.7	_	_
2023 Vggnet16	6	UNSAT		-	75.8	50.8	32.0	-	-
2023 Vggnet16	7	UNSAT	9.41	-	77.1	-	42.4	-	-
	8	UNSAT	11.1	-	228	-	121	-	-
2023 Vggnet16 2023 Vggnet16	9 10	UNSAT UNSAT		_	88.2 101	51.2	36.8 60.8	-	-
2023 Vggnet16 2023 Vggnet16	11	UNSAT		_	115	_	68.3	_	_
2023 Vggnet16	12	UNSAT		_	-	-	-	_	_
2023 Vggnet16	13	UNSAT	20.7	-	287	-	229	-	-
2023 Vggnet16	14		41.8	-	-	-	632	-	-
2023 Vggnet16	15	SAT	-	3.03	33.7	36.1	-	-	-
2023 Vggnet16 2023 Vggnet16	$\frac{16}{17}$? ?	-	-	-	-	-	-	-
2023 Vit	0	UNSAT	-	12.2	-	-	-	-	-
2023 Vit	1	UNSAT	-	12.2	-	-	-	-	-
2023 Vit	2	UNSAT		13.2	-	-	-	-	-
2023 Vit	3	UNSAT		13.2	-	-	-	-	-
2023 Vit 2023 Vit	4 5	UNSAT UNSAT		13.1 14.2	-	_	_	-	-
2023 Vit 2023 Vit	6	UNSAT		13.1	_	_	_	_	_
2023 Vit	7	UNSAT		13.2	-	-	-	-	-
2023 Vit	8	UNSAT		14.3	-	-	-	-	-
	9	UNSAT		13.2	-	-	-	-	-
2023 Vit 2023 Vit	10	UNSAT		13.3	-	-	-	-	-
	11 12	UNSAT UNSAT		13.1 13.2	-	_	_		-
2023 Vit 2023 Vit	13	UNSAT		13.2	_	_	_	_	-
2023 Vit	14	UNSAT		14.1	-	-	-	-	-
2023 Vit	15	UNSAT	11.3	13.3	-	-	-	-	-
2023 Vit	16	UNSAT		13.3	-	-	-	-	-
2023 Vit	17	UNSAT		13.2	-	-	-	-	-
2023 Vit 2023 Vit	18 19	UNSAT UNSAT		13.2 13.2	-	_	-	-	-
2020 VII	13	UNSAI	-	10.2	_	-	-	-	-

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result α - β -C	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Vit	20	UNSAT -	13.3	-	-	-	-	-
2023 Vit	21	UNSAT -	13.1	-	-	-	-	-
2023 Vit	22	UNSAT -	13.2	-	-	-	-	-
2023 Vit	23	UNSAT -	13.2	_	-	-	-	-
2023 Vit 2023 Vit	$\frac{24}{25}$	UNSAT - UNSAT 9.17	13.2 13.2	_	_	_	_	_
2023 Vit 2023 Vit	26	UNSAT 19.7	13.2	_	_	_	_	_
2023 Vit	27	UNSAT -	14.3	_	_	-	_	_
2023 Vit	28	UNSAT -	13.3	-	-	-	-	-
2023 Vit	29	UNSAT -	14.3	-	-	-	-	-
2023 Vit	30	UNSAT -	14.3	-	-	-	-	-
2023 Vit	31	UNSAT -	12.2	-	-	-	-	-
2023 Vit 2023 Vit	$\frac{32}{33}$	UNSAT 7.42 UNSAT 9.54	14.2 13.2	-	-	-	-	-
2023 Vit 2023 Vit	34	UNSAT -	14.2	_	_	_	_	_
2023 Vit	35	UNSAT -	13.2	_	_	_	_	_
2023 Vit	36	unsat 9.99	13.2	-	-	-	-	-
2023 Vit	37	UNSAT -	13.3	-	-	-	-	-
2023 Vit	38	UNSAT -	13.2	-	-	-	-	-
2023 Vit	39	UNSAT -	13.2	-	-	-	-	-
2023 Vit	40	UNSAT -	13.2	-	-	-	-	-
2023 Vit 2023 Vit	$\frac{41}{42}$	UNSAT - UNSAT -	14.2 13.2	_	_	_	_	-
2023 Vit 2023 Vit	43	UNSAT -	13.2	_	_	_	_	_
2023 Vit	44	UNSAT -	14.2	_	-	-	-	_
2023 Vit	45	UNSAT -	13.2	-	-	-	-	-
2023 Vit	46	UNSAT -	13.2	-	-	-	-	-
2023 Vit	47	UNSAT -	13.3	-	-	-	-	-
2023 Vit	48	UNSAT -	13.2	-	-	-	-	-
2023 Vit 2023 Vit	49 50	UNSAT 6.94 UNSAT 20.8	13.2 13.2	_	-	-	-	-
2023 Vit 2023 Vit	51	UNSAT -	13.2	_	-	_	_	-
2023 Vit	52	UNSAT 11.7	13.3	_	_	_	_	-
2023 Vit	53	UNSAT -	13.2	-	-	-	-	-
2023 Vit	54	UNSAT -	13.2	-	-	-	-	-
2023 Vit	55	unsat 14.0	14.2	-	-	-	-	-
2023 Vit	56	UNSAT 8.19	13.2	-	-	-	-	-
2023 Vit	57	UNSAT 11.3	14.2 14.2	_	-	-	-	-
2023 Vit 2023 Vit	58 59	UNSAT - UNSAT 9.13	13.2	_	-	-	-	-
2023 Vit 2023 Vit	60	UNSAT -	13.2	_	_	_	_	-
2023 Vit	61	UNSAT -	13.2	_	-	_	-	_
2023 Vit	62	UNSAT 18.7	13.1	-	-	-	-	-
2023 Vit	63	unsat 9.56	14.2	-	-	-	-	-
2023 Vit	64	UNSAT -	13.2	-	-	-	-	-
2023 Vit	65	UNSAT -	13.2	-	-	-	-	-
2023 Vit	66	UNSAT 9.13	14.2	-	-	-	-	-
2023 Vit 2023 Vit	67 68	UNSAT 10.4 UNSAT -	13.2 13.3	_	-	-	-	-
2023 Vit 2023 Vit	69	UNSAT 28.4	13.2	_	_	_	_	-
2023 Vit	70	UNSAT 7.04	14.2	_	_	_	_	_
2023 Vit	71	UNSAT -	13.2	-	-	-	-	-
2023 Vit	72	UNSAT 10.5	13.2	-	-	-	-	-
2023 Vit	73	unsat 7.00	13.2	-	-	-	-	-
2023 Vit	74	UNSAT -	13.3	-	-	-	-	-
2023 Vit	75 76	UNSAT -	13.2	-	-	-	-	-
2023 Vit 2023 Vit	$\frac{76}{77}$	UNSAT 19.3 UNSAT -	13.1 13.2	-	_	-	-	-
2023 Vit 2023 Vit	78	UNSAT - UNSAT 8.31	13.2	-	_	_	_	_
2023 Vit 2023 Vit	79	UNSAT 7.46	14.2	-	_	_	_	-
2023 Vit	80	UNSAT 10.4	13.2	-	-	-	-	-
2023 Vit	81	UNSAT 9.62	13.3	-	-	-	-	-
2023 Vit	82	unsat 10.5	12.2	-	-	-	-	-
2023 Vit	83	UNSAT 8.64	13.3	-	-	-	-	-
2023 Vit	84	UNSAT 6.98	13.1	-	-	-	-	-
2023 Vit	85 86	UNSAT -	13.2	-	-	-	-	-
2023 Vit 2023 Vit	86 87	UNSAT 9.52 UNSAT 7.83	13.2 13.2	_	_	-	-	-
2020 110	01	0110111 1.00	10.2					

Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α-β-C	Mar	ab PyRat	NSAT	NNen	NNV	FastBaT
2023 Vit	88	UNSAT	9.07	14.2	-	-	-	-	-
2023 Vit	89	UNSAT		13.2	-	-	-	-	-
2023 Vit	90	UNSAT		13.2	-	-	-	-	-
2023 Vit	91	UNSAT		13.2	-	-	-	-	-
2023 Vit 2023 Vit	92 93	UNSAT		$13.2 \\ 13.2$	-	-	-	-	-
2023 Vit 2023 Vit	94	UNSAT UNSAT		14.3	-	_	_	_	-
2023 Vit	95	UNSAT		14.2	_	_	_	_	_
2023 Vit	96	UNSAT		14.2	-	-	-	-	-
2023 Vit	97	UNSAT	8.69	13.2	-	-	-	-	-
2023 Vit	98	UNSAT		13.2	-	-	-	-	-
2023 Vit	99	UNSAT		13.2	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT		$60.2 \\ 60.2$	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT		58.1	-	-	_	-	-
2023 Vit		UNSAT		60.2	_	_	-	_	_
2023 Vit		UNSAT		58.1	-	-	-	-	-
2023 Vit	105	UNSAT	33.2	59.9	-	-	-	-	-
2023 Vit	106	UNSAT	-	58.0	-	-	-	-	-
2023 Vit		UNSAT		59.1	-	-	-	-	-
2023 Vit		UNSAT		61.1	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT		$58.0 \\ 53.9$	-	_	-	-	-
2023 Vit 2023 Vit		UNSAT		60.1	-	_	_	_	-
2023 Vit		UNSAT		59.2	_	_	_	_	-
2023 Vit		UNSAT		57.1	-	-	-	-	-
2023 Vit	114	UNSAT	-	58.0	-	-	-	-	-
2023 Vit	115	UNSAT	-	60.0	-	-	-	-	-
2023 Vit		UNSAT		58.0	-	-	-	-	-
2023 Vit		UNSAT		59.0	-	_	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT		61.1 61.1	-	_	-	-	-
2023 Vit 2023 Vit		UNSAT		59.1	-	_	_	_	-
2023 Vit		UNSAT		60.0	_	_	_	_	_
2023 Vit		UNSAT		59.0	-	-	-	-	-
2023 Vit	123	UNSAT	31.7	58.0	-	-	-	-	-
2023 Vit		UNSAT		58.2	-	-	-	-	-
2023 Vit		UNSAT		58.3	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT		54.9 59.2	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT		58.1	-	_	_	_	_
2023 Vit		UNSAT		57.1	_	_	_	_	_
2023 Vit		UNSAT		59.0	-	_	-	_	-
2023 Vit	131	UNSAT	-	54.9	-	-	-	-	-
2023 Vit		UNSAT		59.2	-	-	-	-	-
2023 Vit		UNSAT		58.2	-	-	-	-	-
2023 Vit		UNSAT		59.0	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT	9.04	$56.9 \\ 56.0$	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT		60.0	-	_	_	_	-
2023 Vit			_	59.2	_	_	-	_	_
2023 Vit			-	57.9	-	_	-	_	-
2023 Vit	140	UNSAT	34.7	58.0	-	-	-	-	-
2023 Vit		UNSAT		57.0	-	-	-	-	-
2023 Vit		UNSAT		58.2	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT		57.9 59.1	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT		57.2	-	_	-	_	-
2023 Vit 2023 Vit		UNSAT		58.0	-	_	_	_	_
2023 Vit		UNSAT		54.9	_	_	_	_	_
2023 Vit		UNSAT		61.3	-	-	-	-	-
2023 Vit		UNSAT		59.0	-	-	-	-	-
2023 Vit		UNSAT		55.9	-	-	-	-	-
2023 Vit		UNSAT		59.1	-	-	-	-	-
2023 Vit		UNSAT		56.1	-	-	-	-	-
2023 Vit		UNSAT		57.9	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT UNSAT		62.0 61.3	-	_	-	_	-
2020 VIO	100	UNSAL	14.4	01.0	-				

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Table 35: Instance Runtimes. Fastest times are blue. Second fastest are green. Penalties are red crosses (x).

Category	Id	Result	α-β-C	Marab	PyRat	NSAT	NNen	NNV	FastBaT
2023 Vit	156	UNSAT	34.1	59.0	-	-	_	-	_
2023 Vit	157	UNSAT	34.8	59.9	-	-	-	-	-
2023 Vit	158	UNSAT	-	58.8	-	-	-	-	-
2023 Vit	159	UNSAT	-	57.0	_	_	_	-	-
2023 Vit	160	UNSAT	40.6	58.0	_	_	_	-	-
2023 Vit	161	UNSAT	-	59.2	_	_	_	-	-
2023 Vit	162	UNSAT	12.3	60.1	_	_	_	-	-
2023 Vit	163	UNSAT	_	58.1	_	_	-	_	_
2023 Vit		UNSAT	-	60.1	_	-	_	-	-
2023 Vit	165	UNSAT	31.8	55.9	_	_	-	_	_
2023 Vit	166	UNSAT	_	57.1	_	_	-	_	_
2023 Vit	167	UNSAT	_	60.0	_	_	_	_	_
2023 Vit			_	61.0	_	_	_	_	_
2023 Vit			_	61.1	_	_	_	_	_
2023 Vit			_	57.0	_	_	_	_	_
2023 Vit			_	60.1	_	_	_	_	_
2023 Vit		UNSAT		59.1	_	_	_	_	_
2023 Vit		UNSAT		60.2	_	_	_	_	_
2023 Vit			_	57.9	_	_	_	_	_
2023 Vit		UNSAT		56.8	_	_	_	_	_
2023 Vit		UNSAT		57.8	_	_	_	_	_
2023 Vit		UNSAT		57.1	_	_	_	_	_
2023 Vit		UNSAT		59.1	_	_	_	_	_
2023 Vit			-	60.0	_	_	_	_	_
2023 Vit 2023 Vit			_	60.1			_		
2023 Vit 2023 Vit			_	57.0			_		
2023 Vit 2023 Vit		UNSAT		62.1	_		_		
2023 Vit 2023 Vit		UNSAT		56.1	_	_	_	_	_
2023 Vit 2023 Vit		UNSAT		59.0	_	_	-	_	-
2023 Vit 2023 Vit		UNSAT		56.0		_	_	_	-
2023 Vit 2023 Vit			-	59.1	_	_	_	_	-
2023 Vit 2023 Vit			_	60.1	_	_	_	_	-
2023 Vit 2023 Vit		UNSAT		58.0	-	-	-	-	-
2023 Vit 2023 Vit		UNSAT		59.2	_	-	_	-	-
					-	-	-	-	-
2023 Vit		UNSAT		56.9	-	-	-	-	-
2023 Vit			-	59.1	-	-	-	-	-
2023 Vit		UNSAT		56.9	-	-	-	-	-
2023 Vit			11.2	61.3	-	-	-	-	-
2023 Vit		UNSAT		57.0	-	-	-	-	-
2023 Vit			-	56.9	-	-	-	-	-
2023 Vit			-	60.1	-	-	-	-	-
2023 Vit			-	59.2	-	-	-	-	-
2023 Vit	198	UNSAT	-	53.8	-	-	-	-	-
2023 Vit	199	UNSAT	34.2	56.0	-	-	-	-	-