

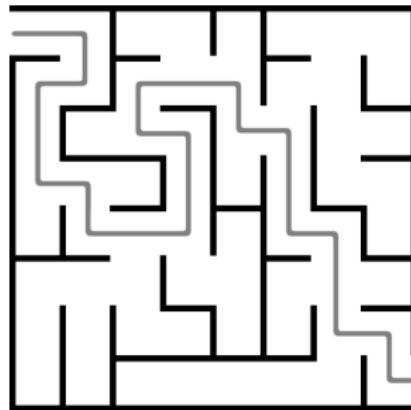
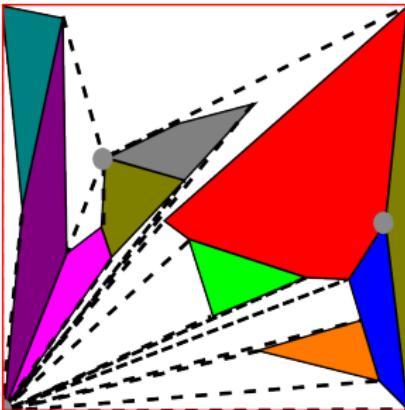
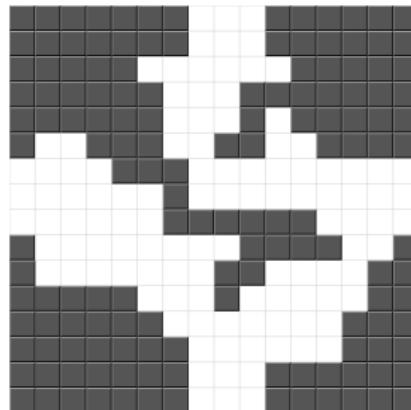
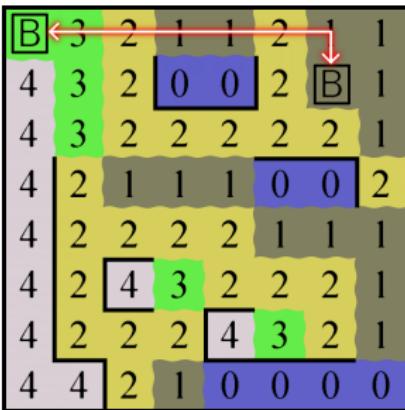
SAT Modulo Monotonic Theories

Sam Bayless*, Noah Bayless†, Holger H. Hoos*, Alan J. Hu*

*University of British Columbia

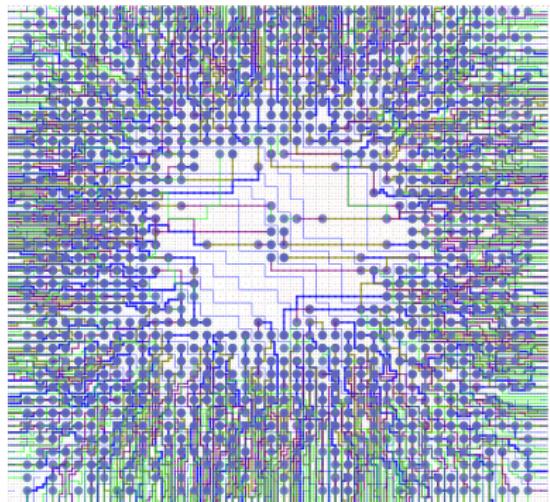
†Point Grey Secondary School

Procedural Content Generation

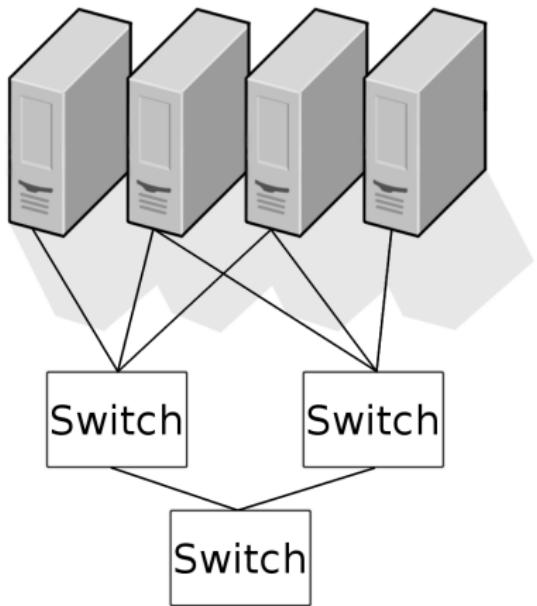


MonoSAT Applications

Circuit Layout

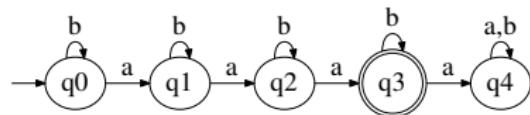


Data Center Allocation

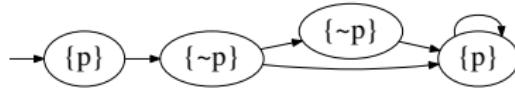


MonoSAT Applications

Finite State Machine Synthesis



CTL Controller Synthesis



MonoSAT

MonoSAT is a SAT Modulo Theory Solver for:

- Graph Predicates:

- ▶ Reachability
- ▶ Shortest paths
- ▶ Maximum $s - t$ flow
- ▶ Minimum Spanning Tree
- ▶ Acyclicity

MonoSAT

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- Graph Predicates:
 - ▶ Reachability
 - ▶ Shortest paths
 - ▶ Maximum $s - t$ flow
 - ▶ Minimum Spanning Tree
 - ▶ Acyclicity
- Collision Detection for Convex Hulls
- Finite State Machine String Acceptance
- L-Systems, Boolean Geometry, CTL checking (soon)

These are all *monotonic theories*

Boolean Monotonic Theories

A function p is a *Boolean monotonic predicate* iff:

- ① : p returns a Boolean
- ② : All arguments are of p are Boolean
- ③ : $p(\dots, F, \dots) \implies p(\dots, T, \dots)$

Boolean Monotonic Theories

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- ① : p returns a Boolean
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- ③ : $p(\dots, \text{F}, \dots) \implies p(\dots, \text{T}, \dots)$

Definition (Boolean Monotonic Theory)

A theory T with signature Σ is Boolean monotonic if and only if:

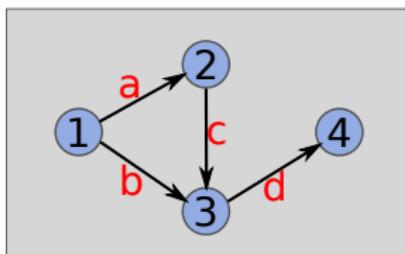
- ① The only sort in Σ is Boolean;
- ② all predicates in Σ are monotonic; and
- ③ all functions in Σ are monotonic.

Graph Constraints in SMT

A formula over Booleans, edges, and monotonic predicates:

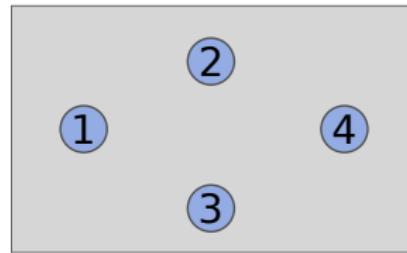
$$(a \vee \neg b) \wedge (b \vee c) \wedge (\neg c \vee \neg d) \wedge (\text{reaches}_{1,3} \vee \text{reaches}_{1,4})$$

And 1 or more symbolic graphs:



Graph Constraints in SMT

'Reachability' is Boolean monotonic:

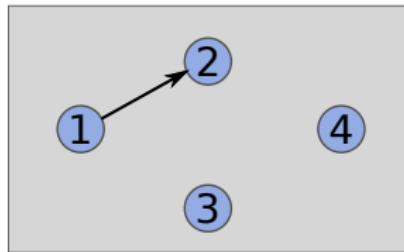


$\text{reaches}_{1,3} \mapsto \text{False}$

$\text{reaches}_{1,4} \mapsto \text{False}$

Graph Constraints in SMT

'Reachability' is Boolean monotonic:

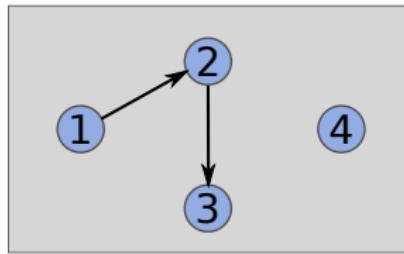


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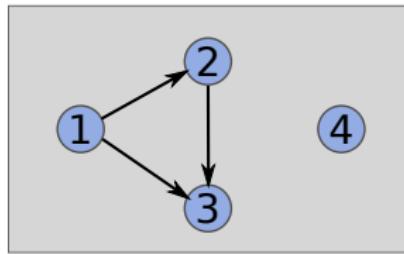


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Graph Constraints in SMT

'Reachability' is Boolean monotonic:

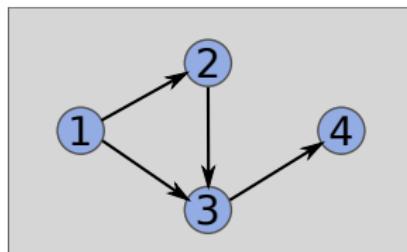


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Graph Constraints in SMT

'Reachability' is Boolean monotonic:



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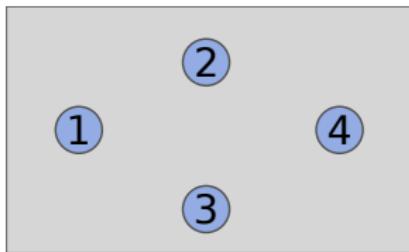
$\text{reaches}_{1,4} \mapsto \text{True}$

Theory Propagation in SMTT

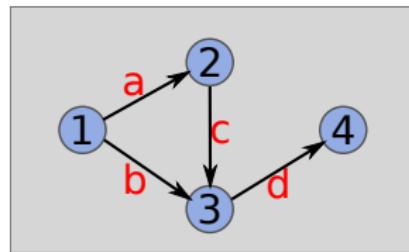
Formula:

$$(a \vee \neg b) \wedge (b \vee c) \wedge (\neg c \vee \neg d) \wedge (reaches_{1,3} \vee reaches_{1,4})$$

Assignment:



Underapproximation



Overapproximation

$$reaches_{1,3}$$

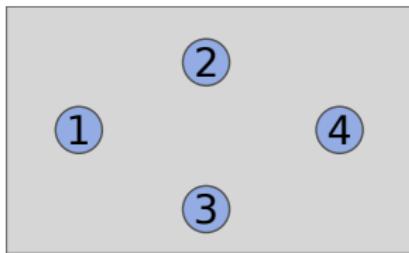
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Theory Propagation in SMTT

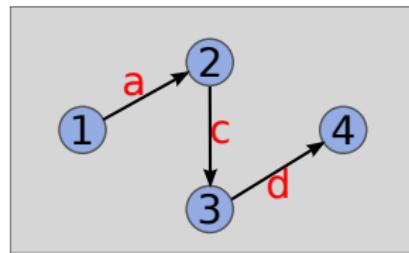
Formula:

$$(a \vee \neg b) \wedge (b \vee c) \wedge (\neg c \vee \neg d) \wedge (reaches_{1,3} \vee reaches_{1,4})$$

Assignment: $\neg b$



Underapproximation



Overapproximation

$$reaches_{1,3}$$

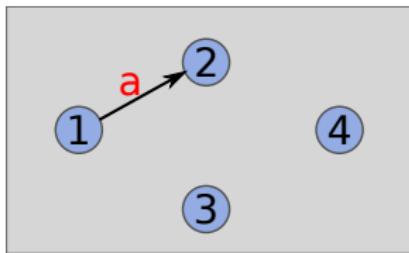
$$reaches_{1,4}$$

Theory Propagation in SMTT

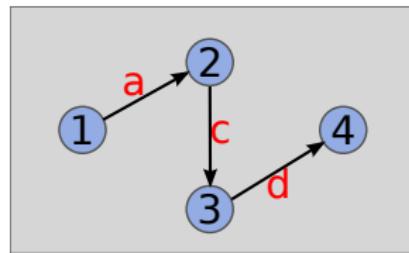
Formula:

$$(a \vee \neg b) \wedge (b \vee c) \wedge (\neg c \vee \neg d) \wedge (\text{reaches}_{1,3} \vee \text{reaches}_{1,4})$$

Assignment: $\neg b, a$



Underapproximation



Overapproximation

$$\text{reaches}_{1,3}$$

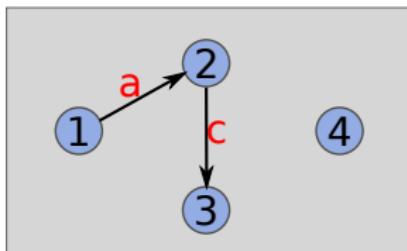
$$\text{reaches}_{1,4}$$

Theory Propagation in SMT

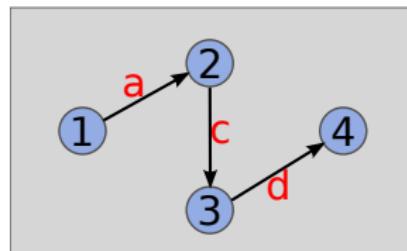
Formula:

$$(a \vee \neg b) \wedge (b \vee c) \wedge (\neg c \vee \neg d) \wedge (\text{reaches}_{1,3} \vee \text{reaches}_{1,4})$$

Assignment: $\neg b, a, c$



Underapproximation



Overapproximation

$$\text{reaches}_{1,3} \mapsto \text{True}$$

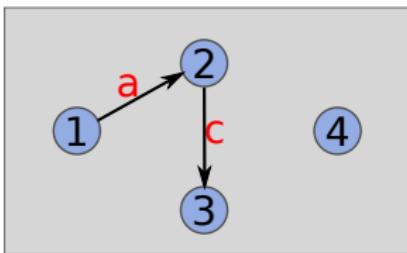
$$\text{reaches}_{1,4}$$

Theory Propagation in SMT

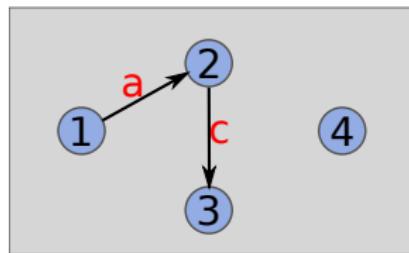
Formula:

$$(a \vee \neg b) \wedge (b \vee c) \wedge (\neg c \vee \neg d) \wedge (\text{reaches}_{1,3} \vee \text{reaches}_{1,4})$$

Assignment: $\neg b, a, c, \neg d$



Underapproximation



Overapproximation

$$\text{reaches}_{1,3} \mapsto \text{True}$$

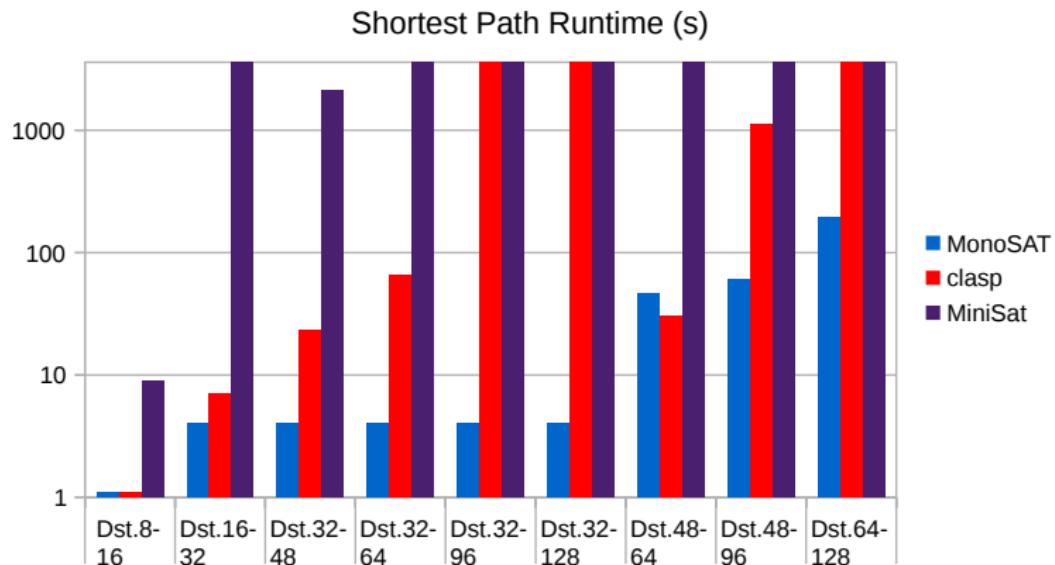
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Theory Propagation in SMT

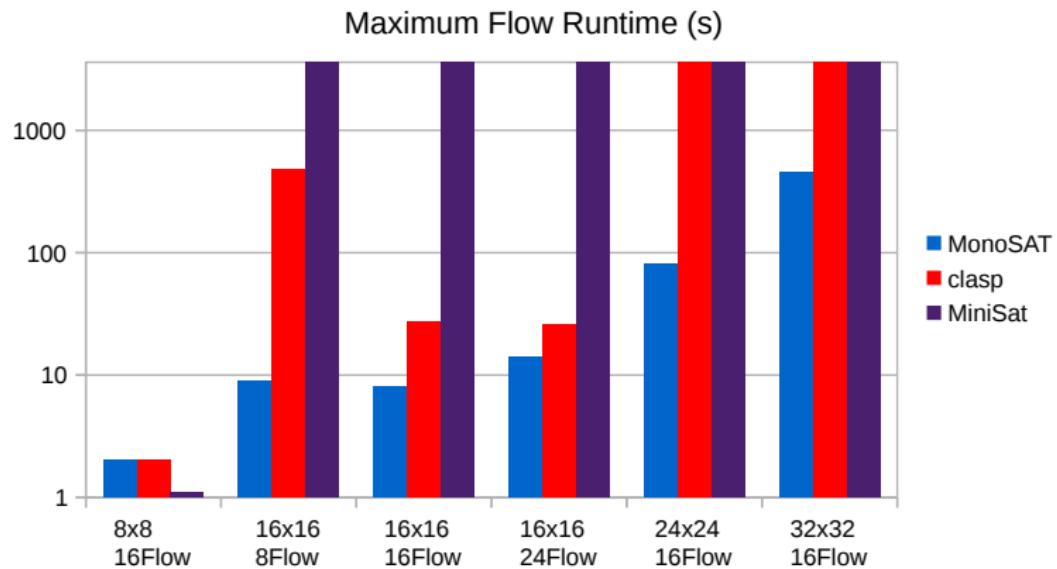
Theory propagation in SMT has useful properties:

- Easy to implement.
- Can use off-the-shelf algorithms.
- Improved worst-case clause learning.

MonoSAT Applications: Shortest Path Constraints

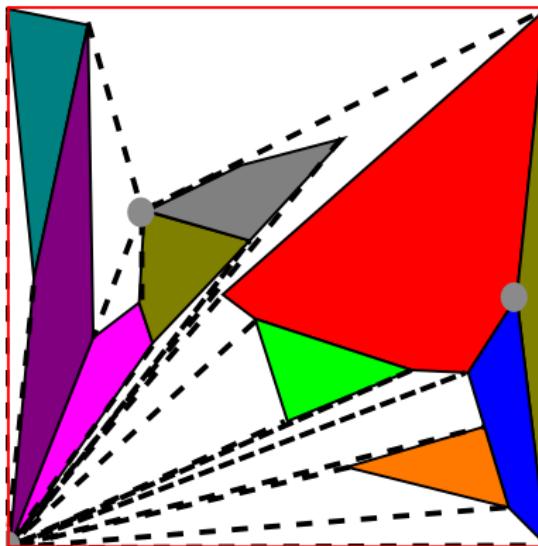


MonoSAT Applications: Maximum Flow Constraints



MonoSAT Applications: Convex Hull Containment

Art Gallery Synthesis	MonoSAT	Z3
10 points, 3 hulls, ≤ 3 cameras	2s	7s
20 points, 4 hulls, ≤ 4 cameras	36s	433s
30 points, 5 hulls, ≤ 5 cameras	187s	> 3600s
40 points, 6 hulls, ≤ 6 cameras	645s	> 3600s
50 points, 7 hulls, ≤ 7 cameras	3531s	> 3600s



Conclusion

- Monotonic theories have *many* applications.
- Building SMT solvers for them is easy.
- MonoSAT supports many graph properties (and more!), and it is free & open-source:
 - ▶ *New!* Bit vector support,
 - ▶ *New!* Python support.

Website: cs.ubc.ca/labs/isd/Projects/monosat

GitHub: github.com/sambayless/monosat

MonoSAT + Python

```
from monosat import *

a = Var()
b = Var()
c = Or(a, Not(b))

Assert(c)

result = Solve()
```

MonoSAT + Python

```
from monosat import *
g= Graph()
e1 = g.addEdge(1,2)
e2 = g.addEdge(2,3)
e3 = g.addEdge(1,3)

Assert(Not(And(e1,e3)))

Assert(g.reaches(1,3))

result = Solve()
```

MonoSAT + Python

```
from monosat import *
g= Graph()
e1 = g.addEdge(1,2)
e2 = g.addEdge(2,3)
e3 = g.addEdge(1,3)

Assert(Or(g.reaches(1,3),
          g.distance_leq(1,3,2)))

result = Solve()
```

MonoSAT + Python

```
from monosat import *
g= Graph()
bv1 = BitVector(4)
bv2 = BitVector(4)
bv3 = BitVector(4)
e1 = g.addEdge(1,2,bv1)
e2 = g.addEdge(2,3,bv2)

Assert(g.distance_leq(1,3,bv3))
Assert(Not(g.distance_lt(1,3,bv3)))

Assert((bv1 + bv3) == 9)

result = Solve()
```