### Laziness in Automated Reasoning

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### About me

#### Resume

- 2018 2021: Bachelor in Engineering at ULiège
- 2021 2023: Masters in Computer Science & Engineering at ULiège
- Winter 2022: Internship at TU Wien
- October 2023 now: PhD at TU Wien

### Research interests - Automated reasoning

- Propositional satisfiability (SAT)
- Satisfiability modulo theories (SMT)
- Saturation-based theorem proving (Vampire)

### About me

### Random Facts

- I speak Chinese and lived in China for a year
- I am Chess enthusiast
- I am a Game Master for Dungeons & Dragons
- I played the clarinet for many years
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### Random Facts

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- ...
- I enjoy laziness

### Trust

Do you trust automatic systems?

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(a) Metro Line 14 in Paris - Fully automated

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(b) Pilotless planes?

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(a) Metro Line 14 in Paris - Fully automated



(b) Pilotless planes?



(c) Autonomous medical robots?

### Trust

Do you trust automatic systems? Engineers never make mistakes, right?



(a) Metro Line 14 in Paris - Fully automated and verified



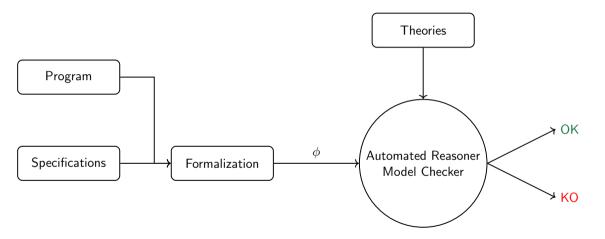
(b) Pilotless planes?



(c) Autonomous medical robots?

What is it was verified?

### Verification Pipeline



# **Opinions on Laziness**

Definition (Laziness)

the quality of not being willing to work or use any effort. (Cambridge Dictionary)

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Laziness is the mother of all evil.

Sophocles

### Laziness in Computer Science

Laziness is a programmer's best virtue.

Larry Wall

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Laziness is a programmer's best virtue.

Larry Wall

I choose a lazy person to do a hard job. Because a lazy person will find an easy way to do it.

Bill Gates

### Laziness in Algorithms

#### Definition

An algorithm is lazy if it delays the computation of a value until that value is actually needed.

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Is laziness a good strategy?

# Is laziness a good strategy?

### Well,... No



# Is laziness a good strategy?

But sometimes,... Yes



### Beautiful Properties of SAT Solving

### Invariant (Backward compatible watched literals)

Consider the trail  $\pi = \tau \cdot \omega$ . For each clause  $C \in F$  watched by the two distinct watched literals  $c_1, c_2$ , we have  $\neg c_1 \in \tau \Rightarrow [c_2 \in \pi \land \delta(c_2) \le \delta(c_1)]$ .

# Beautiful Properties of SAT Solving



4	9			1		3		
				7			9	
5					9		4	
	3	4				7		
		2	6					3
			1		7	2		
		8					2	5
6					8			1
	5			6				

4	9			1		3		
				7			9	
5			$\mathbf{2_1}$		9		4	
	3	4				7		
		2	6					3
			1		7	2		
		8					2	5
6					8			1
	5			6				

4	9		81	1		3		
				7			9	
5			$2_1$		9		4	
	3	4				7		
		2	6					3
			1		7	2		
		8					2	5
6					8			1
	5			6				

4	9		81	1		3		
				7			9	
5			$2_1$	<b>3</b> 1	9		4	
	3	4				7		
		2	6					3
			1		7	2		
		8					2	5
6					8			1
	5			6				

4	9		81	1		3		
				7			9	
5			$2_1$	$3_1$	9		4	
	3	4	<b>9</b> 1			7		
		2	6					3
			1		7	2		
		8					2	5
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	5			6				

4	9		81	1		3		
				7			9	
5			$2_1$	$3_1$	9		4	
	3	4	$9_1$			7		
		2	6		<b>4</b> <sub>1</sub>			3
			1		7	2		
		8					2	5
6					8			1
	5			6				

4	9		81	1		3		
				7			9	
5			$2_1$	$3_1$	9		4	
	3	4	$9_1$			7		82
		2	6		41			3
			1		7	2		
		8					2	5
6					8			1
	5			6				

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		2	6		41			3
			1		7	2		
		8					2	5
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## Chronological Backtracking - Sudoku Example

4	9		81	1		3		
				7			9	$2_2$
5			$2_1$	$3_1$	9		4	
$1_2$	3	4	$9_1$		$\mathbf{2_1}$	7		82
		2	6		41			3
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		8					2	5
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## Lazy Restoration of Invariants (([Coutelier et al. SAT 2024])) Invariant (Lazy reimplication)

If the lazy reimplication reason  $\lambda(\ell)$  of literal  $\ell$  is defined, then the clause  $\lambda(\ell)$  is a missed lower implication of  $\ell$ . That is,

$$\lambda(\ell) \neq \blacksquare \implies \ell \in \pi \land \ell \in \lambda(\ell)$$
$$\land (\lambda(\ell) \setminus \{\ell\} \land \pi) \vDash \bot$$
$$\land \delta(\lambda(\ell) \setminus \{\ell\}) < \delta(\ell)$$

#### Invariant (Lazy backtrack compatible watched literals)

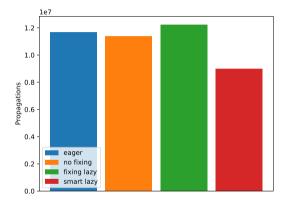
Consider the trail  $\pi = \tau \cdot \omega$ . For each clause  $C \in F$  watched by the two distinct watched literals  $c_1, c_2$ , we have

$$\neg c_1 \in \tau \Rightarrow \left( c_2 \in \pi \land \left( \delta(c_2) \le \delta(c_1) \lor \delta(\lambda(c_2) \setminus \{c_2\}) \le \delta(c_1) \right) \right)$$

### Lazy Restoration of Invariants



# Results ([Coutelier et al. SAT 2024])



Number of propagations performed by NapSAT on 100 random 3-SAT problems with 250 variables.

### Laziness in Team Work

#### Lazy Meter



### Laziness in Team Work

#### Lazy Meter



Very lazy

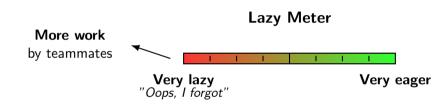
### Laziness in Team Work

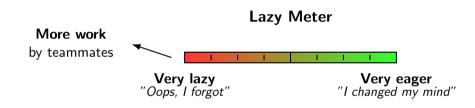
#### Lazy Meter

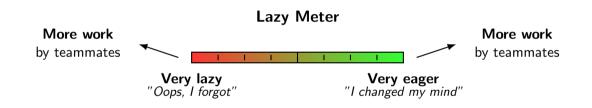


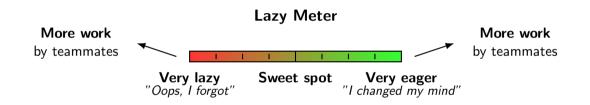
Very lazy "Oops, I forgot"











### SAT-SMT Team Work

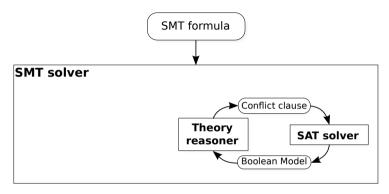


Figure: Schematic of a typical SMT solver.

# ULiège-TU Wien Collaboration

#### Project

- **Goal**: Improve the efficiency of SAT and SMT solvers by using Chronological Backtracking.
- Partners: TU Wien, ULiège
- Duration: 3 years
- Funding: Fondation Gochet

#### Components and Functionalities of $\operatorname{MODULARIT}$

- $\bullet~\mathrm{NapSAT}$  SAT solver developed based on [Coutelier, Thesis 2024] (TU Wien)
- Congruence closure algorithm (ULiège)
- Term manager (ULiège)
- On going: Quantifier instantiation (ULiège)
- On going: Probability Reasoning (TU Wien)

### Conclusion

- Automated Reasoning is an important field in Computer Science
- Laziness can be a good strategy if used correctly
- A lazy approach to invariant maintenance can improve SAT solvers

#### Future Work

- Analyze the impact of Chronological Backtracking on SMT solvers
- Search collaboration strategies between SAT and SMT solvers

### **Publication List**

- Robin Coutelier. Chronological vs. Non-Chronological Backtracking in SMT. Master Thesis 2023.
- Robin Coutelier, Jakob Rath, Michael Rawson, and Laura Kovács. *SAT-Based Subsumption Resolution*. In CADE 2023.
- Robin Coutelier, Mathias Fleury, and Laura Kovács. *Lazy Reimplication in Chronological Backtracking*. In SAT 2024.
- Robin Coutelier. To Link or Not to Link? In PoS 2024.
- Robin Coutelier, Jakob Rath, Michael Rawson, Armin Biere, and Laura Kovács. SAT Solving for Variants of First-Order Subsumption. In FMSD 2024.