

# Clausal Proofs of Mutilated Chessboards

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NASA Formal Methods

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# Certificates

What makes a problem **hard**?

Certificate angle: can one **efficiently check** an alleged solution?



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Is **searching** for the solution harder  
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	4	3						
						7	9	
			6					
			1	4		5		
9							1	
2								6
				7	2			
	5					8		
			9					

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Intuition: yes!

However, many problems for which  
we can efficiently check a solution  
turn out to be easy **in practice**.

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

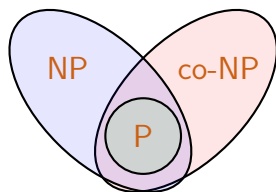
# Certificates and Complexity

Complexity classes of decision problems:

**P** : efficiently computable answers.

**NP** : efficiently checkable yes-answers.

**co-NP** : efficiently checkable no-answers.



**Cook-Levin Theorem [1971]**: SAT is **NP-complete**.

Solving the  **$P \stackrel{?}{=} NP$**  question is worth **\$1,000,000** [Clay MI '00].

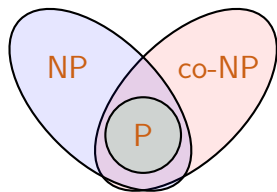
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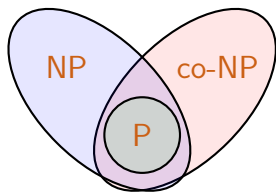
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**What about co-NP?**

How to find **short** proofs for interesting problems **efficiently?**

# Original Motivation for Producing and Validating Proofs

Automated reasoning tools may give **incorrect answers**.

- ▶ Documented **bugs** in SAT, SMT, and QSAT solvers;
- ▶ Implementation errors often imply **conceptual errors**;
- ▶ Proofs now **mandatory** in some competitive events;  
[Balyo, Heule, and Järvisalo '17]
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Major challenge:

- ▶ Some “simple” problems have **exponentially large proofs** in the resolution proof system [Urquhart '87, Buss and Pitassi '98];
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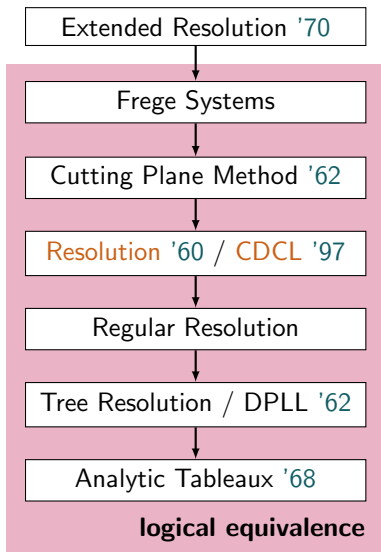
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Requires a proof system to compactly express all techniques.

# Proof Search in Strong Proof Systems

## Existence of Short Proofs





# Satisfaction-Driven Clause Learning [Heule, Kiesl, Biere '17B]

SDCL **generalizes** CDCL and finds proofs in the SPR proof system.

CDCL in a nutshell:

1. Main loop combines **efficient** problem simplification with **cheap**, but effective decision heuristics; (> 90% of time)
2. Reasoning kicks in if the current state is **conflicting**;
3. The current state is analyzed and turned into a **constraint**;
4. The constraint is **added** to the problem, the heuristics are **updated**, and the algorithm (partially) **restarts**.

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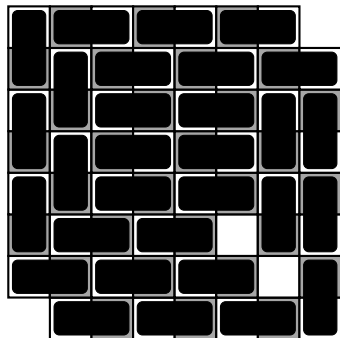
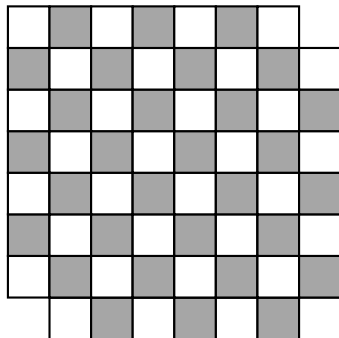
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**Short proofs for problems that are hard for resolution**  
including pigeonhole, Tseitin, and mutilated chessboard problems

## Mutilated Chessboards: “A Tough Nut to Crack” [McCarthy]

Can a chessboard be fully covered with dominos after removing two diagonally opposite corner squares?

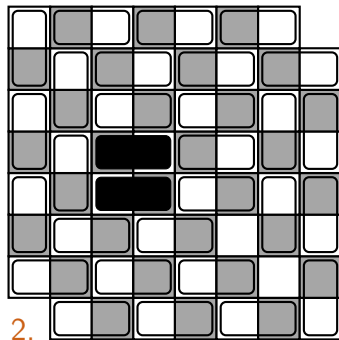
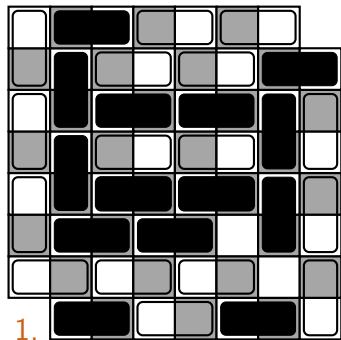






## Without Loss of Satisfaction

One of the crucial techniques in SAT solvers is to **generalize a conflicting state** and use it to constrain the problem.

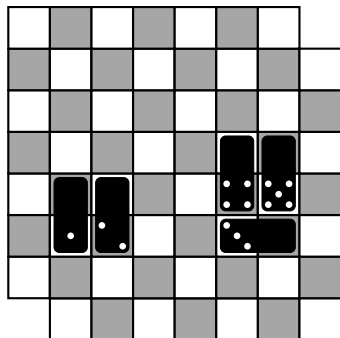
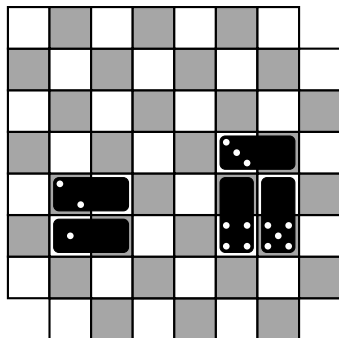


The used proof system can have a big impact on the size:

1. Resolution can only reduce the 30 dominos to 14 (left); and
2. “Without loss of satisfaction” can reduce them to 2 (right).

## Mutilated Chessboards: An alternative proof

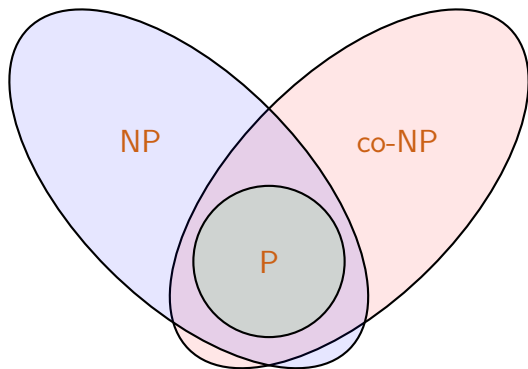
Satisfaction-Driven Clause Learning (SDCL) is a new solving paradigm that finds proofs in the PR proof system [HVC'17]



SDCL can detect that the above two patterns can be **blocked**

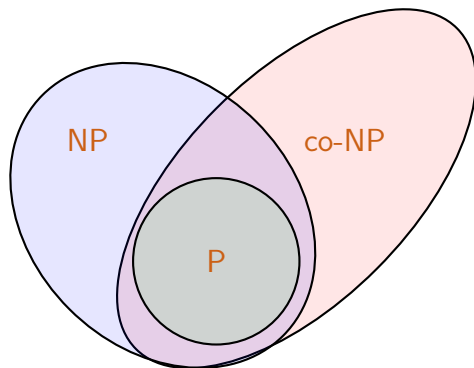
- ▶ This reduces the number of explored states **exponentially**
- ▶ We produced SPR proofs that are **linear** in the formula size

## Complexity Classes Closer in Practice



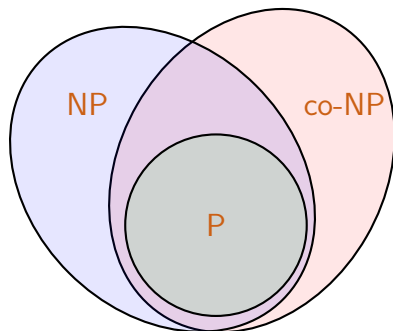
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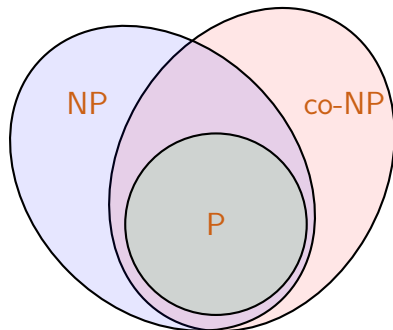
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**“co-NP is the new NP!”**

## Future Work: Arbitrarily Complex Solvers

Verifying efficient automated reasoning tools is a **daunting task**:

- ▶ Tools are constantly modified and **improved**; and
- ▶ Even top-pier and “experimentally correct” solvers turned out to be **buggy**. [Järvisalo, Heule, Biere '12]

Verified checkers of certificates in strong proof systems:

- ▶ **Don't worry** about correctness or completeness of tools;
- ▶ Facilitates making tools more complex and **efficient**; while
- ▶ **Full confidence** in results. [Heule, Hunt, Kaufmann, Wetzler '17]



**Formally verified checkers now also used in industry**