

# Verifying SAT Encodings in Lean

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**Bryan Parno**, committee member



Thesis at

<http://crcodel.com/research/verified-encodings-thesis.pdf>

# Overview

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We develop **general proof methods and data structures**.

What is an encoding?

The Lean theorem prover

Encoding verification library

Encodings and proofs of correctness

Conclusion

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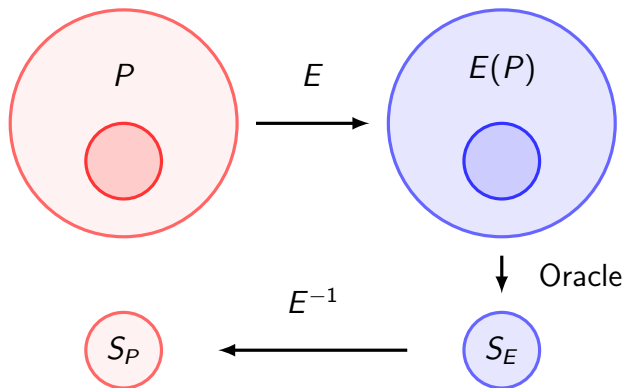
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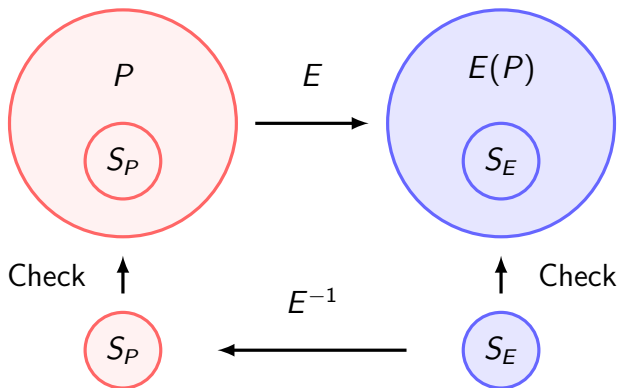
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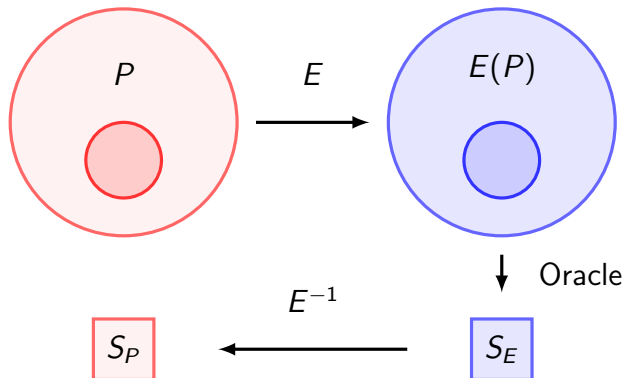
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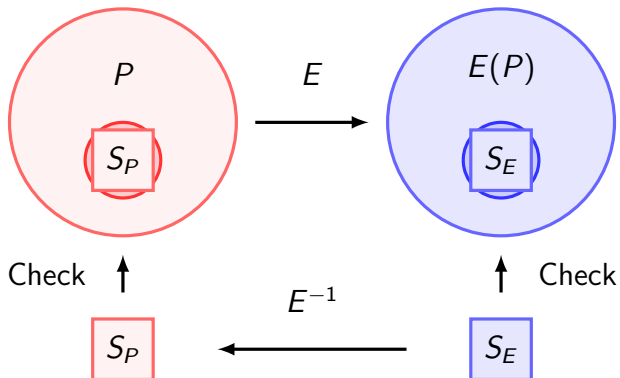
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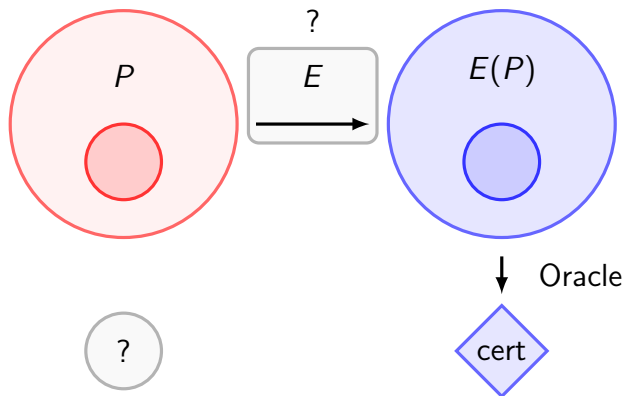
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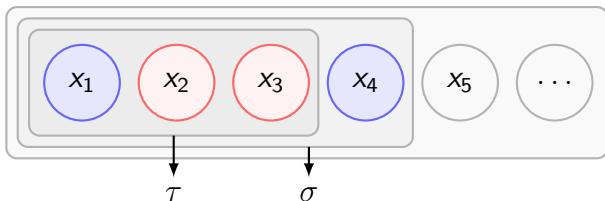
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## Definition: Extended truth assignment

Let  $\tau$  be an assignment on  $V(\tau)$ . Then  $\sigma$  **extends**  $\tau$  if  $V(\tau) \subseteq V(\sigma)$  and  $\forall x \in V(\tau), \tau(x) = \sigma(x)$ .



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## Definition: Encoding of a Boolean relation

Let  $R$  be a Boolean relation,  $F$  be a formula, and  $x_1, \dots, x_n$  be variables representing the inputs of  $R$ . Then  $F$  **encodes**  $R$  iff:  $\forall \tau$  on  $x_1, \dots, x_n, R(\tau(x_1), \dots, \tau(x_n))$  iff  $F$  is satisfied by some assignment that extends  $\tau$ .

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Special case  $R := (f(\tau(x_1), \dots, \tau(x_n)) = \top)$ . Then  $R$  is **defined by**  $f$ .

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Quick demo!



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Basis for future verification efforts

# Encoding verification library - CNF representations

```
inductive literal (V : Type*)  
| Pos (v : V) : literal  
| Neg (v : V) : literal  
  
def clause (V : Type*) := list (literal V)  
def cnf (V : Type*) := list (clause V)  
def assignment (V : Type*) := V -> bool
```

## Encoding verification library - CNF representations

```
def eval ( $\tau$  : assignment V) (c : clause V) : bool :=  
  c.foldr ( $\lambda$  l b, b || (l.eval  $\tau$ )) ff
```

`l.eval` is syntactic sugar for `literal.eval l`

`tt` is true, `ff` is false

# Encoding verification library - CNF representations

```
theorem eval_tt_iff_exists_literal_eval_tt  
  { $\tau$  : assignment V} {c : clause V} :  
  c.eval  $\tau$  = tt  $\leftrightarrow$   $\exists$  (l : literal V), l  $\in$  c  $\rightarrow$  l.eval  $\tau$  = tt
```

```
theorem eval_ff_iff_forall_literal_eval_ff  
  { $\tau$  : assignment V} {c : clause V} :  
  c.eval  $\tau$  = ff  $\leftrightarrow$   $\forall$  (l : literal V), l  $\in$  c  $\rightarrow$  l.eval  $\tau$  = ff
```



## Encoding verification library - gensym

```
structure gensym ( $\alpha$  : Type *) := (offset : nat)
  (f : nat ->  $\alpha$ ) (f_inj : injective f)
```

Inspired by de Bruijn indices, Hilbert's hotel, [Lisp gensym](#)

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def stock : set  $\alpha$  := { a |  $\exists$  (n : nat), g.f (g.offset + n) = a }
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def fresh (g : gensym  $\alpha$ ) : ( $\alpha \times$  gensym  $\alpha$ ) :=
  ⟨g.f (g.offset), ⟨g.offset + 1, g.f, g.f_inj⟩⟩

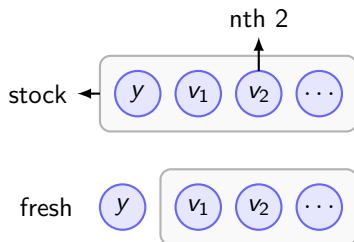
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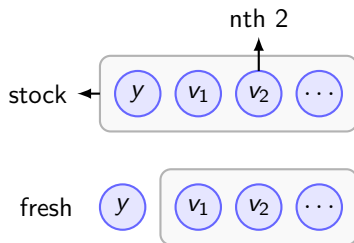


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In practice, `gensym` is often a global int counter.

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# Encodings and proofs of correctness

We proved correct:

- ▶ Two encodings of XOR (direct and Tseitin)
- ▶ Two encodings of AMO (direct and Sinz)
- ▶ One encoding of AMK (Sinz)

# Encodings and proofs of correctness - XOR

## Definition

$\text{XOR}(x_1, \dots, x_n) := \bigoplus_{i=1}^n x_i = \top$  iff an odd number of  $x_i$  are true



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## Important properties

$$\top \oplus x \equiv \bar{x} \qquad \perp \oplus x \equiv x$$

## Encodings and proofs of correctness - XOR, DIRECTXOR

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Generates  $2^{n-1}$  clauses on  $n$  input variables.

Poor performance for solvers above small  $n$ .

## Encodings and proofs of correctness - XOR, DIRECTXOR

```
def direct_xor : list (literal V) → cnf V
| []           := [[]]
| (l :: ls)   := (explode (map var ls)).map
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$$\text{explode}([x, y, z]) = [[x, y, z], [\bar{x}, y, z], [x, \bar{y}, z], [x, y, \bar{z}], \\ [\bar{x}, \bar{y}, \bar{z}], [x, \bar{y}, \bar{z}], [\bar{x}, y, \bar{z}], [\bar{x}, \bar{y}, z]]$$



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def direct_xor : list (literal V) → cnf V
| []           := [[]]
| (1 :: ls)   := (explode (map var ls)).map
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Add in 1 according to parity of clause.

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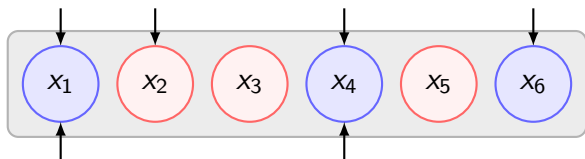
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Odd number of the  $x_i$  true  $\neq$  even number of negations. □

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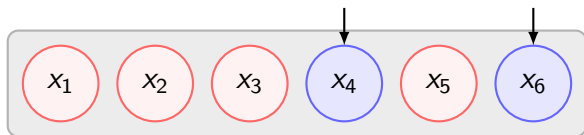
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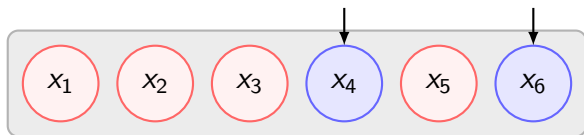
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Takeaway: clauses disallow falsifying inputs—stick to the semantics.

## Encodings and proofs of correctness - XOR, Tseitin

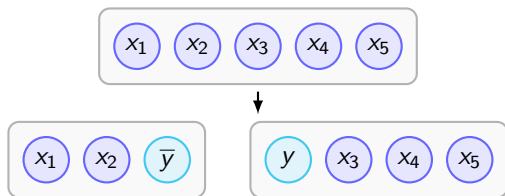
Tseitin encoding (linear)

$$\text{LINEAR}_k(x_1, \dots, x_n) = \begin{cases} \text{DIRECTXOR}(x_1, \dots, x_n) & n \leq k \\ \text{DIRECTXOR}(x_1, \dots, x_{k-1}, \bar{y}) \wedge \text{LINEAR}_k(y, x_k, \dots, x_n) & \text{o.w.} \end{cases}$$

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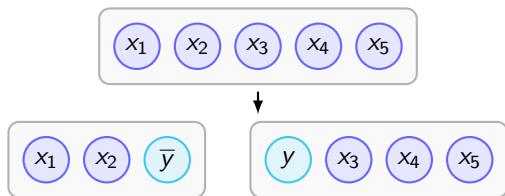




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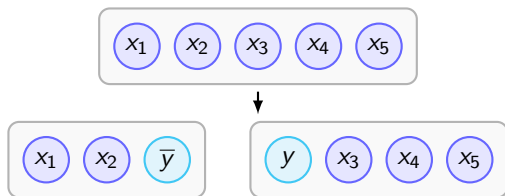


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Fixed  $k \geq 3$  is **cutting number**.

Solver performance impacted by cutting number and linear vs. pooled.

## Encodings and proofs of correctness - XOR, Tseitin

$$\text{LINEAR}_3(x_1, \dots, x_6) = \\ D(x_1, x_2, \bar{y}_1) \wedge D(y_1, x_3, \bar{y}_2) \wedge D(y_2, x_4, \bar{y}_3) \wedge D(y_3, x_5, x_6)$$

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Linear requires  $O(n)$  updates to the  $y_i$ , pooled only  $O(\log n)$ .

## Encodings and proofs of correctness - XOR, Tseitin

```
def linear_xor {k : nat} (hk : k ≥ 3) :  
  list (literal V) → gensym V → cnf V  
| l g := ite (length l ≤ k) (direct_xor l)  
  direct_xor (l.take (k - 1) ++ [Neg g.fresh.1]) ++  
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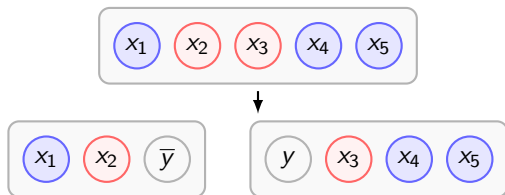
Challenge: generating fresh variables - use `fresh`.

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**Theorem:** The Tseitin transformation encodes XOR.

**Proof.**

By strong induction on  $n$ .

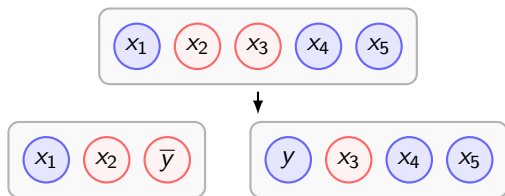


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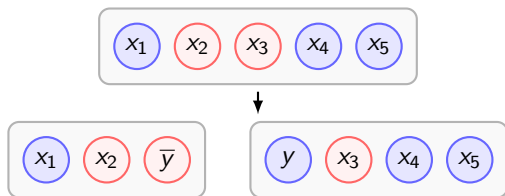


## Encodings and proofs of correctness - XOR, Tseitin

**Theorem:** The Tseitin transformation encodes XOR.

**Proof.**

By strong induction on  $n$ .



□

Takeaway: recursive definitions require inductive proofs.

`fresh` used to generate variables, updated `gensym` passed to recursive call.

# Encodings and proofs of correctness - AMO

Definition

$$\text{AMO}(x_1, \dots, x_n) := \sum_{i=1}^n x_i \leq 1$$

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Part of general class of **cardinality constraints**.

$$\text{AMK}_k(x_1, \dots, x_n) := \sum_{i=1}^n x_i \leq k.$$

## Encodings and proofs of correctness - AMO, DIRECTAMO

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Generates  $\binom{n}{2} \in O(n^2)$  clauses.



## Encodings and proofs of correctness - AMO, DIRECTAMO

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def direct_amo : list (literal V) → cnf V
| []           := []
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Recursive in nature, but global definition possible too

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Recursive in nature, but global definition possible too

Correctness proof analogous to DIRECTXOR.

Developed distinct object to relate to semantics - crucial for proof.

## Encodings and proofs of correctness - AMO, SINZAMO

$$\text{SINZAMO}(x_1, \dots, x_n) = \left( \bigwedge_{i=1}^{n-1} (\bar{x}_i \vee s_i) \right) \wedge \left( \bigwedge_{i=1}^{n-1} (\bar{s}_i \vee \bar{x}_{i+1}) \right) \wedge \left( \bigwedge_{i=1}^{n-2} (\bar{s}_i \vee s_{i+1}) \right)$$

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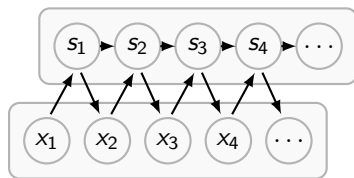
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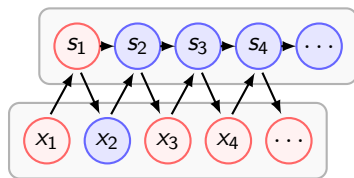
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Non-recursive definition - better for capturing global behavior.

Use `nth` instead of `fresh` to generate variables.



# Encodings and proofs of correctness - AMO, SINZAMO

**Theorem:** SINZAMO encodes AMO

**Proof.**

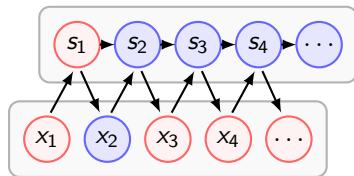
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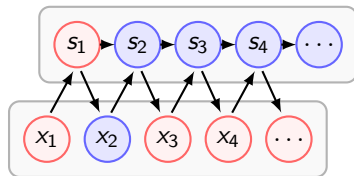


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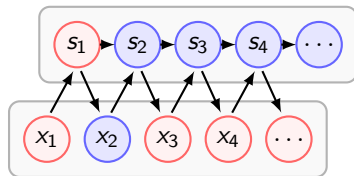
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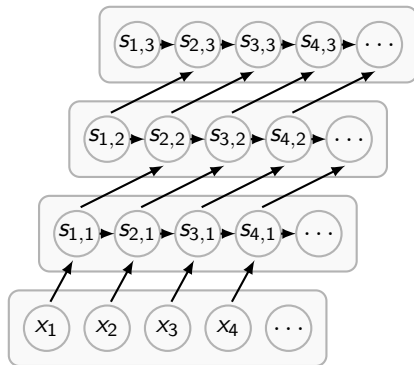
Takeaway: For encoding with global behavior, tie the introduced variables to a semantic definition, and hard-code in a satisfying assignment

## Encodings and proofs of correctness - AMK, Sinz

$$\text{SINZAMK}(x_1, \dots, x_n) = \left( \bigwedge_{i=1}^n (\bar{x}_i \vee s_{i,1}) \right) \wedge \left( \bigwedge_{i=1}^{n-1} \bigwedge_{j=1}^{k+1} (\bar{s}_{i,j} \vee s_{i+1,j}) \right) \wedge \\ \left( \bigwedge_{i=1}^{n-1} \bigwedge_{j=1}^k (\bar{x}_{i+1} \vee \bar{s}_{i,j} \vee s_{i+1,j+1}) \right) \wedge \bar{s}_{n,k+1}$$

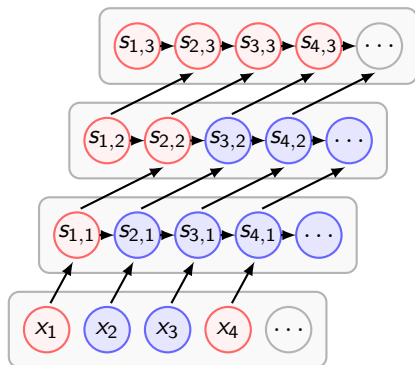
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Takeaway: Again, tie fresh variables to semantic meaning.

What is an encoding?

The Lean theorem prover

Encoding verification library

Encodings and proofs of correctness

Conclusion



## Conclusion

We prove the correctness of several common SAT encodings.

Fresh variable generation and management were challenging—`gensym` is our solution to the problems posed.

The proof methods (recursive vs. non-recursive) are general and will aid future verification efforts.

Future work: verify more encodings.