

Logical Entailment for Projected Model Counting

Sibylle Möhle¹, Roberto Sebastiani², and Armin Biere¹

¹Institute for Formal Models and Verification
LIT Secure and Correct Systems Lab



²Department of Information Engineering
and Computer Science



UNIVERSITY
OF TRENTO

International Workshop on Model Counting (MCW 2020)

9 July 2020

Algorithm

Input: formula $F(X, Y)$ over variables $X \cup Y$ such that $X \cap Y = \emptyset$, trail I , decision level function δ

Output: M number of models of F projected onto X

Count(F)

```
1  $I := \varepsilon; \delta := \infty; M := 0$ 
2 forever do
3    $C := \text{PropagateUnits}(F, I, \delta)$ 
4   if  $C \neq 0$  then
5      $c := \delta(C)$ 
6     if  $c = 0$  then return  $M$ 
7      $\text{AnalyzeConflict}(F, I, C, c)$ 
8     else if all variables in  $X \cup Y$  are assigned then
9       if  $V(\text{decs}(I)) \cap X = \emptyset$  then return  $M + 2^{|X-I|}$ 
10       $M := M + 2^{|X-I|}$ 
11       $b := \delta(\text{decs}(\pi(I, X)))$ 
12       $\text{Backtrack}(I, b - 1)$ 
17 else  $\text{Decide}(I, \delta)$ 
```

Algorithm

Input: formula $F(X, Y)$ over variables $X \cup Y$ such that $X \cap Y = \emptyset$, trail I , decision level function δ

Output: M number of models of F projected onto X

Count(F)

```
1  $I := \varepsilon; \delta := \infty; M := 0$ 
2 forever do
3    $C := \text{PropagateUnits}(F, I, \delta)$ 
4   if  $C \neq 0$  then
5      $c := \delta(C)$ 
6     if  $c = 0$  then return  $M$ 
7     AnalyzeConflict( $F, I, C, c$ )
8   else if all variables in  $X \cup Y$  are assigned then
9     if  $V(\text{decs}(I)) \cap X = \emptyset$  then return  $M + 2^{|X-I|}$ 
10     $M := M + 2^{|X-I|}$ 
11     $b := \delta(\text{decs}(\pi(I, X)))$ 
12    Backtrack( $I, b - 1$ )
13  else if Entails( $I, F$ ) then
14    if  $V(\text{decs}(I)) \cap X = \emptyset$  then return  $M + 2^{|X-I|}$ 
14     $M := M + 2^{|X-I|}$ 
15     $b := \delta(\text{decs}(\pi(I, X)))$ 
16    Backtrack( $I, b - 1$ )
17  else Decide( $I, \delta$ )
```

Logical Entailment Test under Projection

Given: $F(X, Y)$ formula over set of relevant variables X and set of irrelevant variables Y
 I trail over variables in $X \cup Y$

Entailment under projection onto X : $\forall X \exists Y [F|_I]$

Logical Entailment Test under Projection

Given: $F(X, Y)$ formula over set of relevant variables X and set of irrelevant variables Y
 I trail over variables in $X \cup Y$

Entailment under projection onto X : $\forall X \exists Y [F|_I]$

Example: $F(X, Y) = x_1(x_2 \leftrightarrow y_2)$ $X = \{x_1, x_2\}$ $Y = \{y_2\}$

$$F|_{x_1} = (x_2 \leftrightarrow y_2)$$

$$F|_{x_1x_2} = (1 \leftrightarrow y_2) \quad \text{and} \quad F|_{x_1x_2y_2} = 1$$

$$F|_{x_1\bar{x}_2} = (0 \leftrightarrow y_2) \quad \text{and} \quad F|_{x_1\bar{x}_2\bar{y}_2} = 1$$

$$\implies x_1 \models F$$

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit:

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit: (F, I, M, δ)

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit: (F, I, M, δ)

if $F|_I \neq 0$

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

$$\text{Unit: } (F, I, M, \delta) \rightsquigarrow_{\text{Unit}} (F, \quad M, \quad) \text{ if } F|_I \neq 0$$

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit: $(F, I, M, \delta) \rightsquigarrow_{\text{Unit}} (F, \mathbf{I}l, M, \delta)$ if $F|_I \neq 0$ and exists $C \in F$ with $\{l\} = C|_I$

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit: $(F, I, M, \delta) \rightsquigarrow_{\text{Unit}} (F, I\ell, M, \delta[\ell \mapsto a])$ if $F|_I \neq 0$ and exists $C \in F$ with $\{\ell\} = C|_I$ and $a \stackrel{\text{def}}{=} \delta(C \setminus \{\ell\})$

Unit Propagation

Idea: Assign the propagated unit literal the decision level of its reason clause

Unit: $(F, I, M, \delta) \rightsquigarrow_{\text{Unit}} (F, I\ell, M, \delta[\ell \mapsto a])$ if $F|_I \neq 0$ and exists $C \in F$ with $\{\ell\} = C|_I$ and $a \stackrel{\text{def}}{=} \delta(C \setminus \{\ell\})$

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

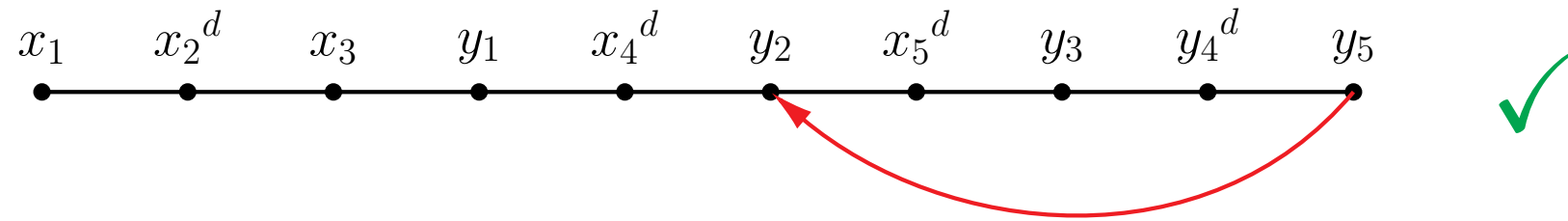
Idea: Flip the last relevant decision literal



Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

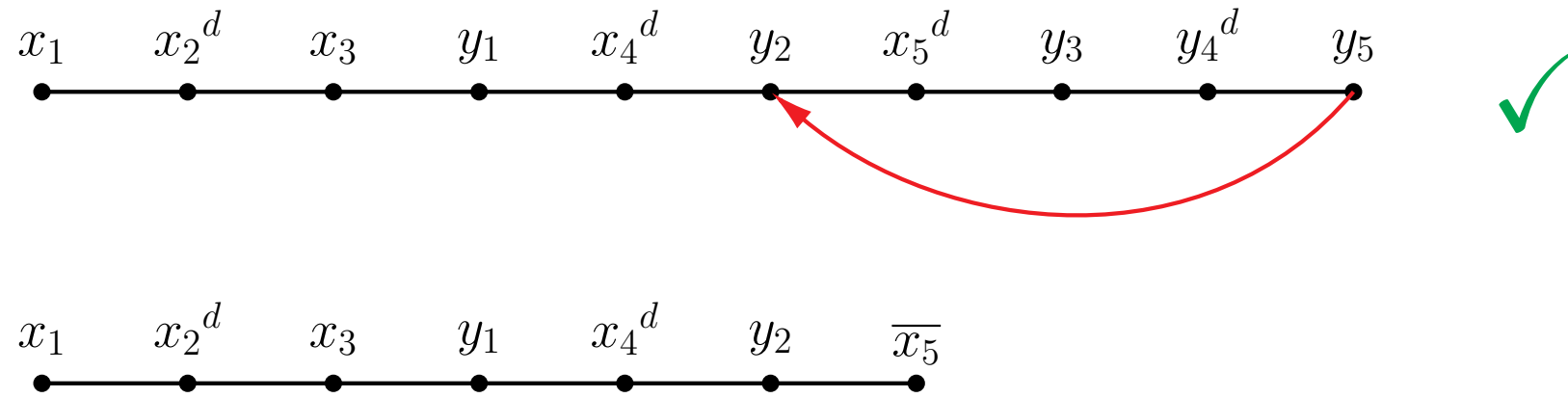
Idea: Flip the last relevant decision literal



Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

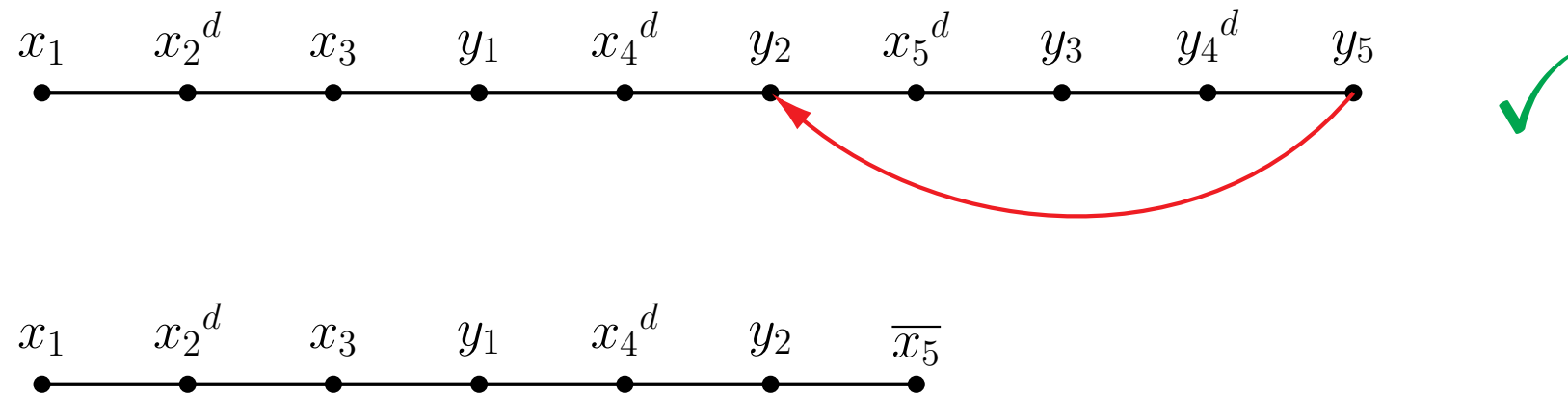
Idea: Flip the last relevant decision literal



Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

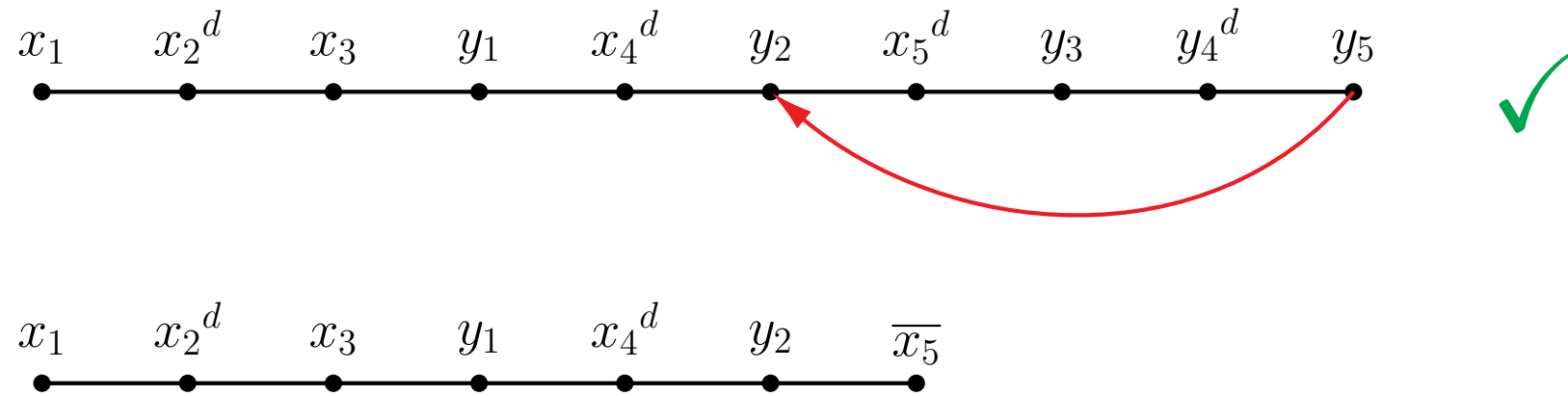


BackTrue:

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

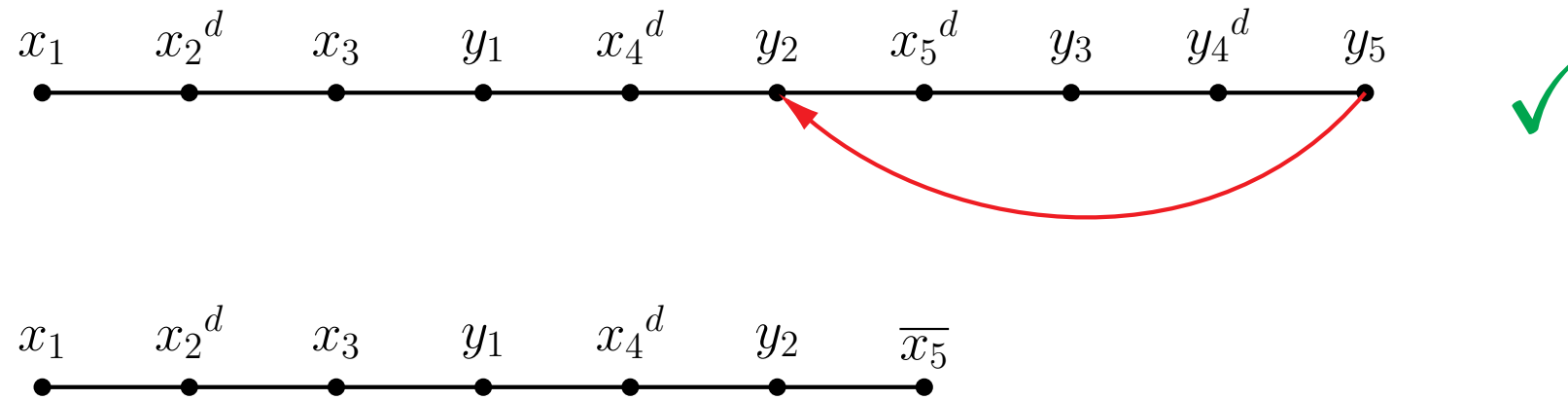


BackTrue: (F, I, M, δ)

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal



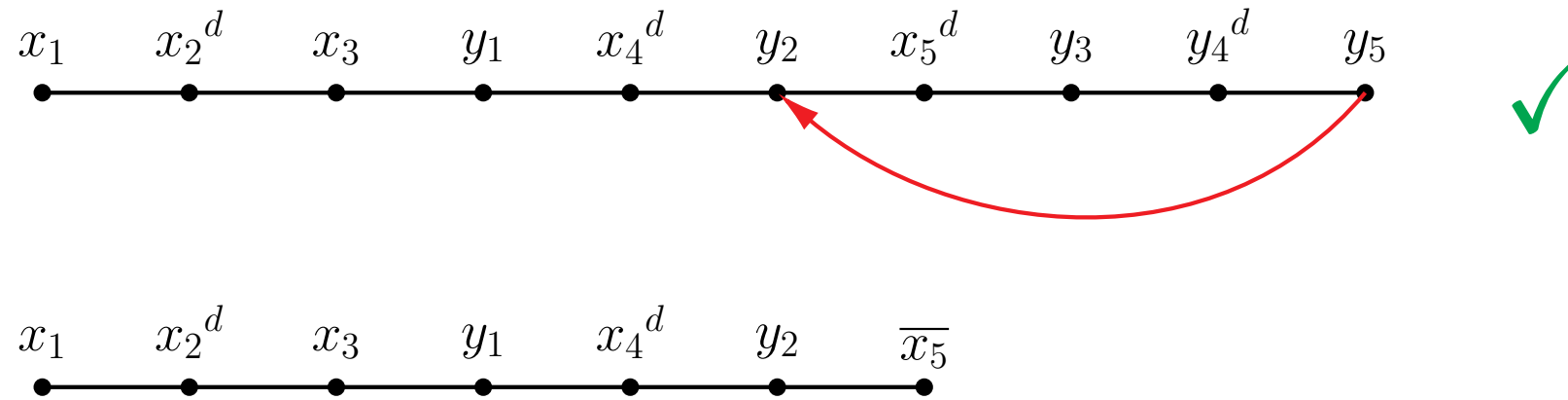
BackTrue: (F, I, M, δ)

if $\forall X \exists Y [F|_I] = 1$

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

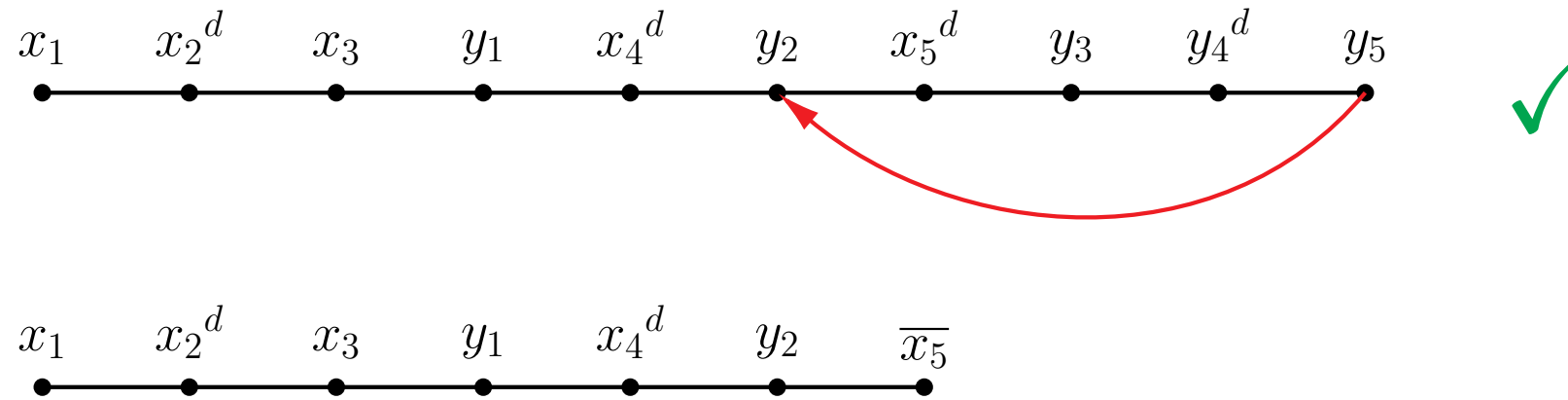


BackTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{BackTrue}} (F, \quad)$ if $\forall X \exists Y [F|_I] = 1$

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

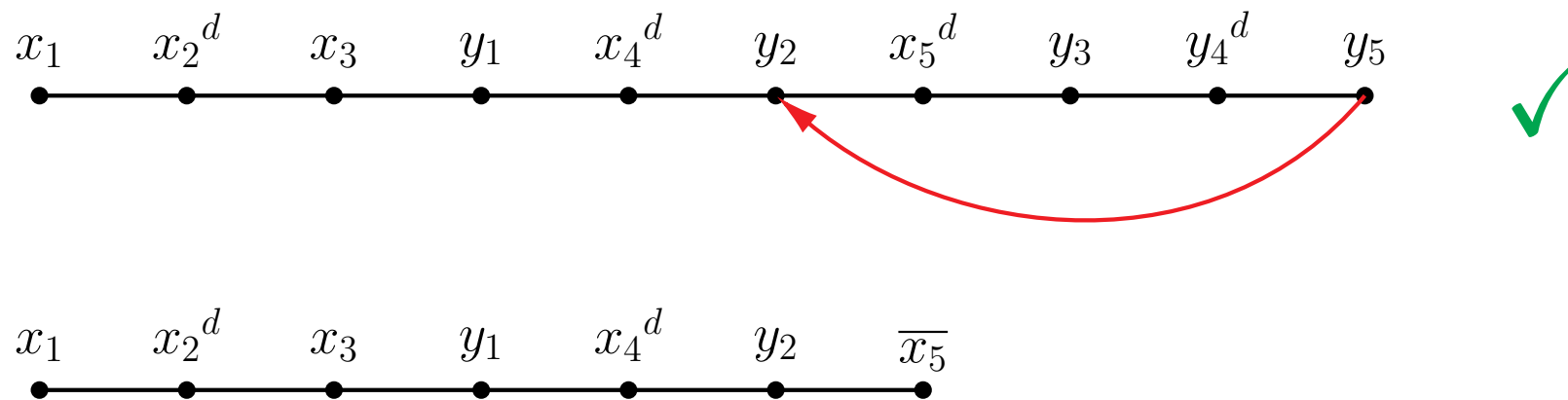


BackTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{BackTrue}} (F, M + m,)$ if $\forall X \exists Y [F|_I] = 1$ and $m \stackrel{\text{def}}{=} 2^{|X-I|}$ and

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

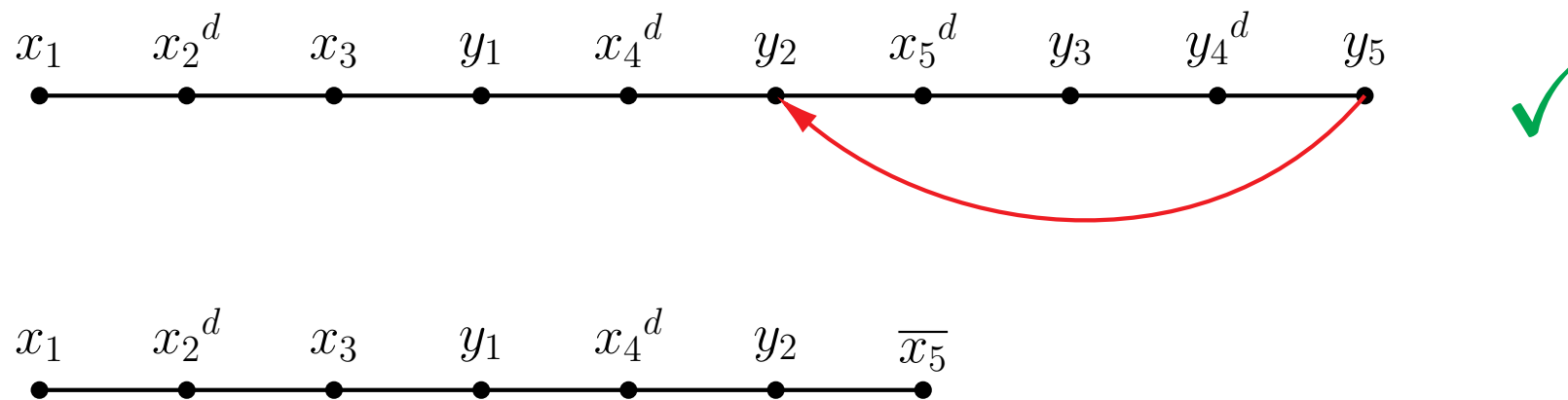


BackTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{BackTrue}} (F, UK\ell, M + m, \quad)$ if $\forall X \exists Y [F|_I] = 1$ and $m \stackrel{\text{def}}{=} 2^{|X-I|}$ and $D \stackrel{\text{def}}{=} \overline{\pi(\text{decs}(I), X)}$ and $\ell \in D$ and $UV \stackrel{\text{def}}{=} I$ and $K \stackrel{\text{def}}{=} V_{\leq b}$ and

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal

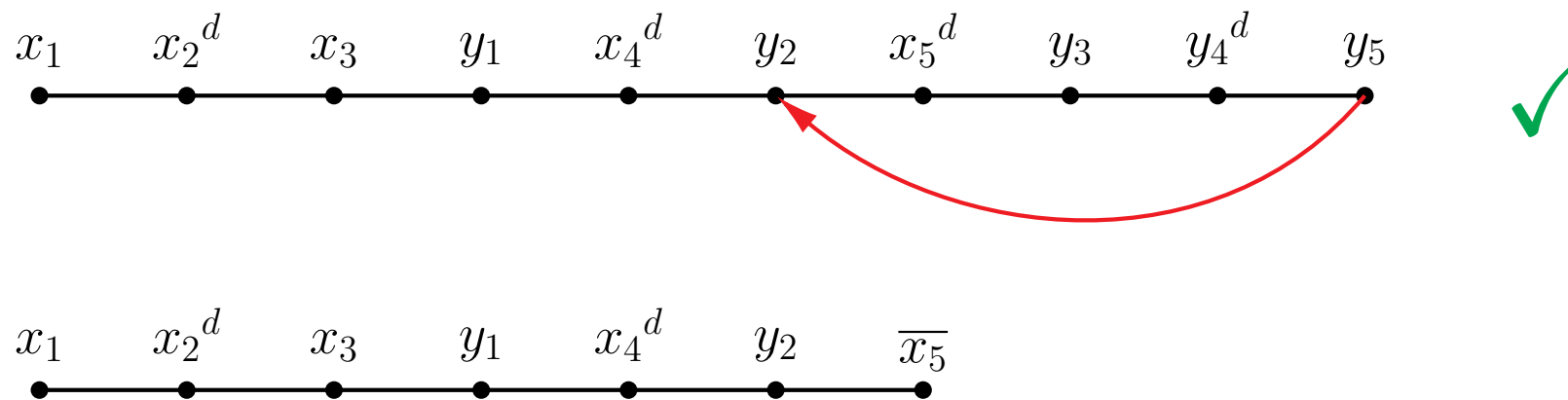


BackTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{BackTrue}} (F, UK\ell, M + m, \delta[L \mapsto \infty][\ell \mapsto b])$ if $\forall X \exists Y [F|_I] = 1$ and $m \stackrel{\text{def}}{=} 2^{|X-I|}$ and $D \stackrel{\text{def}}{=} \overline{\pi(\text{decs}(I), X)}$ and $\ell \in D$ and $UV \stackrel{\text{def}}{=} I$ and $K \stackrel{\text{def}}{=} V_{\leq b}$ and $b = \delta(D \setminus \{\ell\}) = \delta(U)$ and $b + 1 \stackrel{\text{def}}{=} \delta(D) \leq \delta(I)$ and $L \stackrel{\text{def}}{=} V_{> b}$

Backtracking upon Model Found

Given: Formula $F(X, Y)$ over relevant variables X and irrelevant variables Y

Idea: Flip the last relevant decision literal



BackTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{BackTrue}} (F, UK\ell, M + m, \delta[L \mapsto \infty][\ell \mapsto b])$ if $\forall X \exists Y [F|_I] = 1$ and $m \stackrel{\text{def}}{=} 2^{|X-I|}$ and $D \stackrel{\text{def}}{=} \overline{\pi(\text{decs}(I), X)}$ and $\ell \in D$ and $UV \stackrel{\text{def}}{=} I$ and $K \stackrel{\text{def}}{=} V_{\leq b}$ and $b = \delta(D \setminus \{\ell\}) = \delta(U)$ and $b + 1 \stackrel{\text{def}}{=} \delta(D) \leq \delta(I)$ and $L \stackrel{\text{def}}{=} V_{> b}$

Calculus

EndTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{EndTrue}} M + m$ if $V(\text{decs}(I)) \cap X = \emptyset$ and $m \stackrel{\text{def}}{=} 2^{|X-I|}$ and $\forall X \exists Y [F|_I] = 1$

EndFalse: $(F, I, M, \delta) \rightsquigarrow_{\text{EndFalse}} M$ if exists $C \in F$ and $C|_I = 0$ and $\delta(C) = 0$

Unit: $(F, I, M, \delta) \rightsquigarrow_{\text{Unit}} (F, I\ell, M, \delta[\ell \mapsto a])$ if $F|_I \neq 0$ and exists $C \in F$ with $\{\ell\} = C|_I$ and $a \stackrel{\text{def}}{=} \delta(C \setminus \{\ell\})$

BackTrue: $(F, I, M, \delta) \rightsquigarrow_{\text{BackTrue}} (F, UK\ell, M + m, \delta[L \mapsto \infty][\ell \mapsto b])$ if $UV \stackrel{\text{def}}{=} I$ and $D \stackrel{\text{def}}{=} \overline{\pi(\text{decs}(I), X)}$ and $b + 1 \stackrel{\text{def}}{=} \delta(D) \leq \delta(I)$ and $\ell \in D$ and $b = \delta(D \setminus \{\ell\}) = \delta(U)$ and $m \stackrel{\text{def}}{=} 2^{|X-I|}$ and $K \stackrel{\text{def}}{=} V_{\leq b}$ and $L \stackrel{\text{def}}{=} V_{> b}$ and $\forall X \exists Y [F|_I] = 1$

BackFalse: $(F, I, M, \delta) \rightsquigarrow_{\text{BackFalse}} (F, UK\ell, M, \delta[L \mapsto \infty][\ell \mapsto j])$ if exists $C \in F$ and exists D with $UV \stackrel{\text{def}}{=} I$ and $C|_I = 0$ and $c \stackrel{\text{def}}{=} \delta(C) = \delta(D) > 0$ such that $\ell \in D$ and $\bar{\ell} \in \text{decs}(I)$ and $\bar{\ell}|_V = 0$ and $F \wedge \bar{M} \models D$ and $j \stackrel{\text{def}}{=} \delta(D \setminus \{\ell\})$ and $b \stackrel{\text{def}}{=} \delta(U) = c - 1$ and $K \stackrel{\text{def}}{=} V_{\leq b}$ and $L \stackrel{\text{def}}{=} V_{> b}$

DecideX: $(F, I, M, \delta) \rightsquigarrow_{\text{DecideX}} (F, I\ell^d, M, \delta[\ell \mapsto d])$ if $F|_I \neq 0$ and $\text{units}(F|_I) = \emptyset$ and $\delta(\ell) = \infty$ and $d \stackrel{\text{def}}{=} \delta(I) + 1$ and $V(\ell) \in X$

DecideY: $(F, I, M, \delta) \rightsquigarrow_{\text{DecideY}} (F, I\ell^d, M, \delta[\ell \mapsto d])$ if $F|_I \neq 0$ and $\text{units}(F|_I) = \emptyset$ and $\delta(\ell) = \infty$ and $d \stackrel{\text{def}}{=} \delta(I) + 1$ and $V(\ell) \in Y$ and $X - I = \emptyset$

Conclusion

Our Contribution

Method for computing the model count of a formula exploiting logical entailment

- Inspired by the interaction of theory and SAT solvers in SMT
- Adaptation of our method addressing projected partial model enumeration presented at SAT'20

Entailment test in four flavors of increasing strength (in the SAT'20 paper)

- $F|_I = 1$ (syntactic check)
- $F|_I \approx 1$ (incomplete check in \mathbf{P})
- $F|_I \equiv 1$ (semantic check in \mathbf{coNP})
- $\forall X \exists Y [F|_I] = 1$ (check in $\mathbf{\Pi}_2^P$)

Conclusion

Our Contribution

Method for computing the model count of a formula exploiting logical entailment

- Inspired by the interaction of theory and SAT solvers in SMT
- Adaptation of our method addressing projected partial model enumeration presented at SAT'20

Entailment test in four flavors of increasing strength (in the SAT'20 paper)

- $F|_I = 1$ (syntactic check)
- $F|_I \approx 1$ (incomplete check in \mathbf{P})
- $F|_I \equiv 1$ (semantic check in \mathbf{coNP})
- $\forall X \exists Y [F|_I] = 1$ (check in $\mathbf{\Pi}_2^P$)

Further Research

- Implement and validate our method on instances stemming from weighted model integration and model counting with or without projection
- Investigate methods concerning the implementation of QBF oracles (Incremental QBF (Lonsing and Egly, CP'14))
- Combine with decomposition-based approaches (to generate a d-DNNF)