

POLYBORI

advanced normal form computations

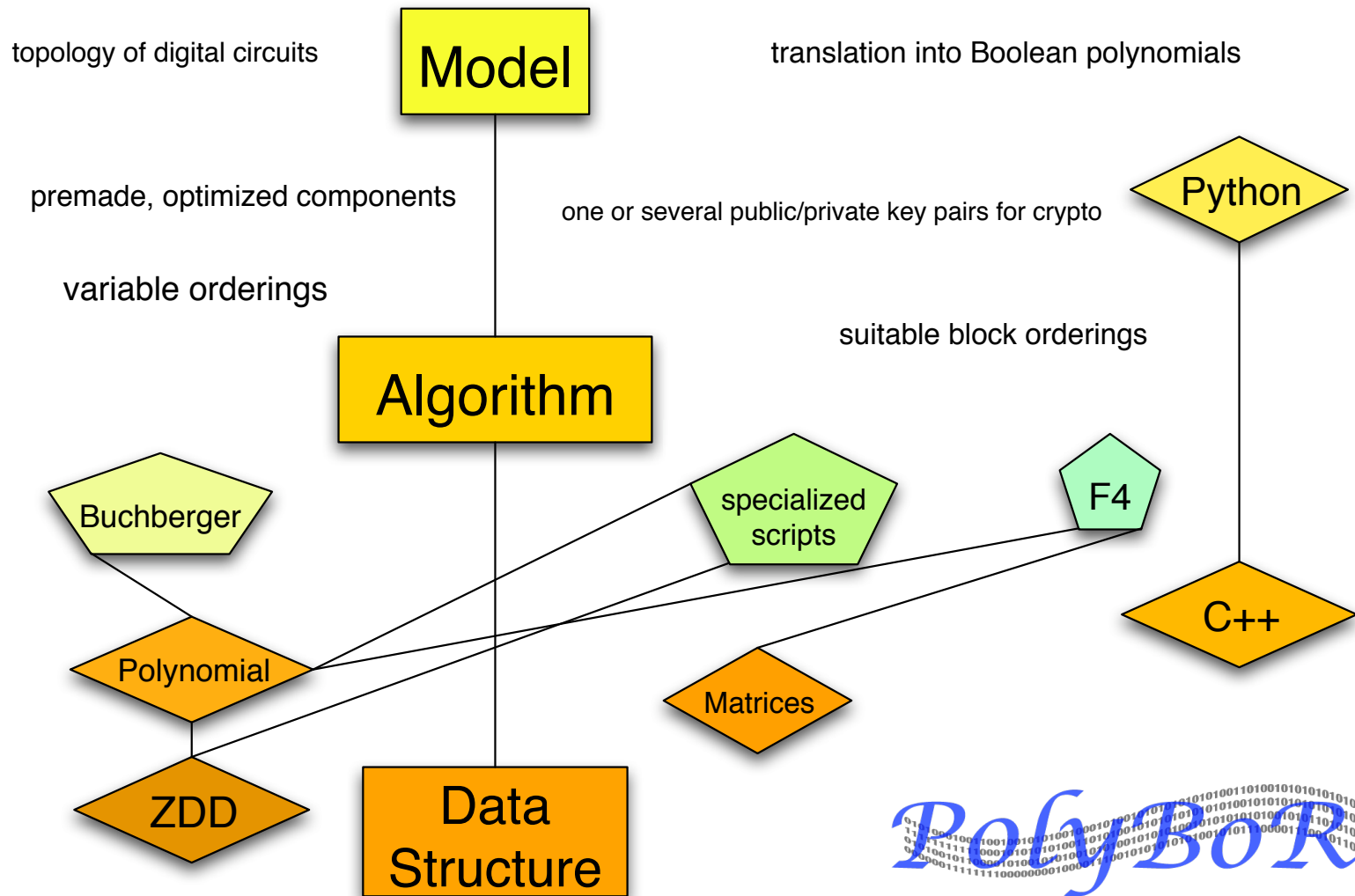
OVERVIEW

- What is PolyBoRi
- Specialized Normal Forms
 - against monomials (warmup)
 - against polynomials with linear leads
 - surprise

GOALS OF THIS TALK

- Using some basic, but interesting math to show
 - what is possible in PolyBoRi
 - how to think in PolyBoRi
- No deeper knowledge of Gröbner bases required

POLYBORI AS FRAMEWORK



PolyBori

BASIC DATA

POLYBORI

Polynomials over ***B***oolean ***R***ings

DFG Project

“Development, implementation and application of mathematical-algebraic algorithms for formal verification of digital systems with arithmetic blocks”

Fraunhofer ITWM

Alexander Dreyer (Department Adaptive Systems)

University of Kaiserslautern

Algebra, Geometry and Computer Algebra Group
(Prof. Greuel, Department of Mathematics)

Doctoral thesis

Michael Brickenstein
(Mathematisches Forschungsinstitut Oberwolfach)

ZDD-ZERO SUPPRESSED DECISION DIAGRAMS

- Underlying data structure
- special kind of decision diagram

BOOLEAN POLYNOMIALS

Interpret Boolean expressions as polynomials over \mathbb{Z}_2

logical operations \rightarrow arithmetical operations and $\{\text{true, false}\} \rightarrow \{0, 1\}$

$$p \in \mathbb{Z}_2[x_1, \dots, x_n] / \langle x_1^2 - x_1, \dots, x_n^2 - x_n \rangle$$

Polynomials as sets

$$p = a_1 \cdot x_1^{\nu_{11}} \cdot \dots \cdot x_n^{\nu_{1n}} + \dots + a_{2^n} \cdot x_1^{\nu_{2^n 1}} \cdot \dots \cdot x_n^{\nu_{2^n n}}$$

$$= \sum_{s \in S_p} (\prod_{x_\nu \in s} x_\nu),$$

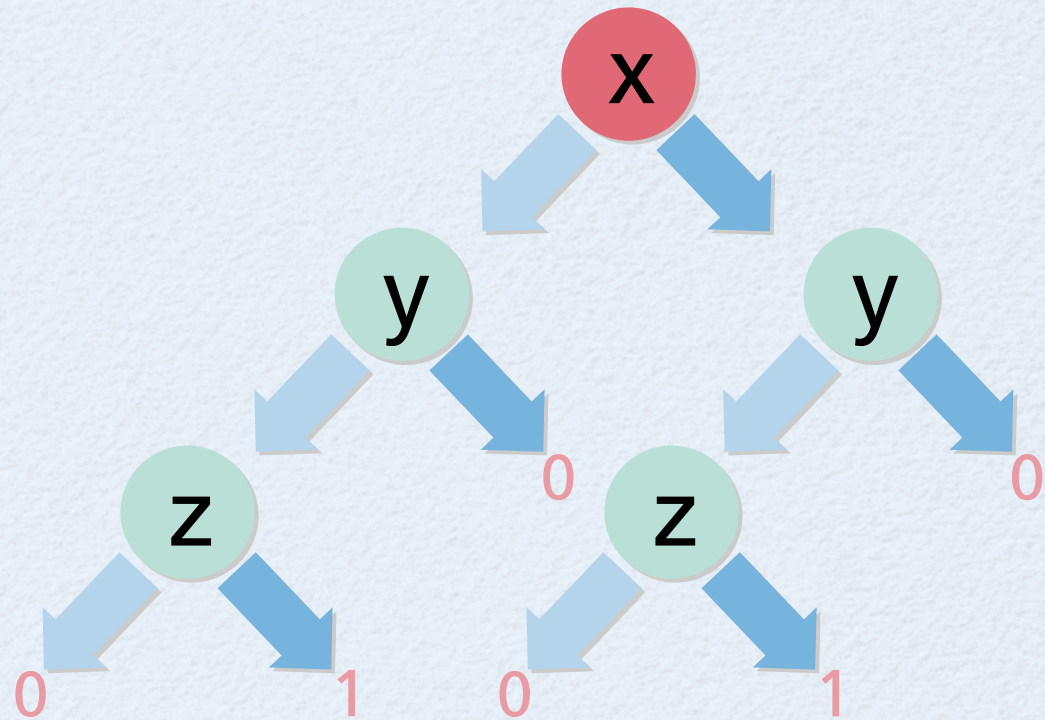
$$\text{with } S_p = \{\{x_{i_1}, \dots, x_{i_{n_1}}\}, \dots, \{x_{i_m}, \dots, x_{i_{n_m}}\}\}$$

$$\subseteq \text{PowerSet}(x_1, \dots, x_n)$$

ZERO -SUPPRESSED BINARY DECISION DIAGRAMS

Binary Decision Diagram

Rooted, directed, acyclic graph,
terminal nodes $\{0, 1\}$, decision
nodes ($\hat{=}$ Boolean variables)



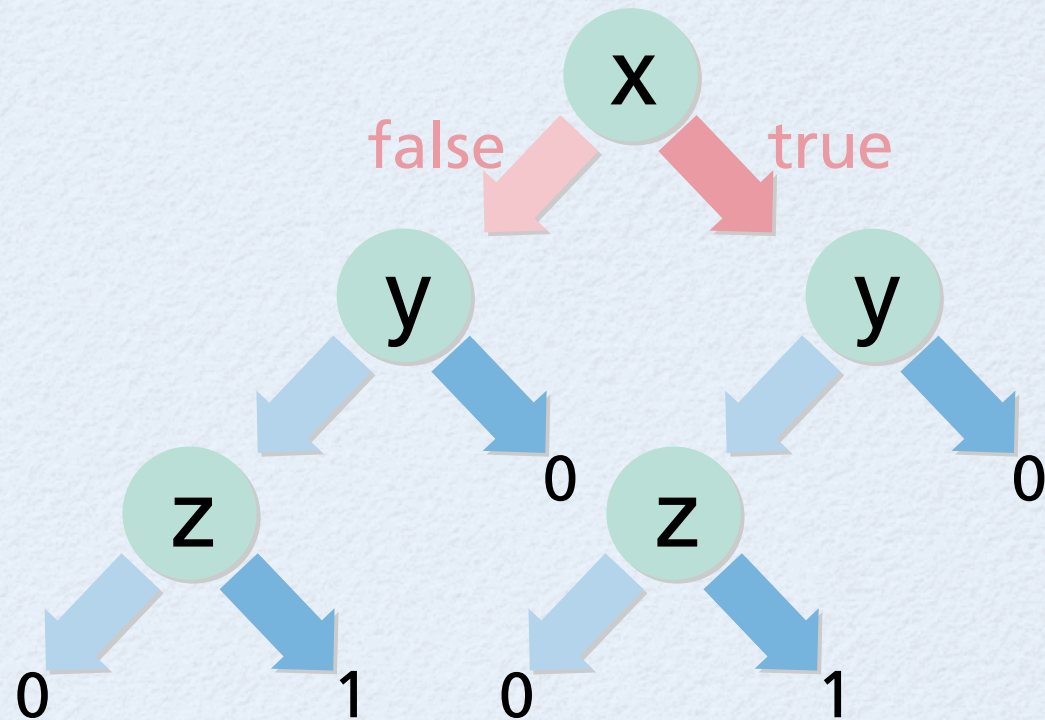
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Two descending edges per node
(high/low or then/else)

$\hat{=}$ assign variable to true/false



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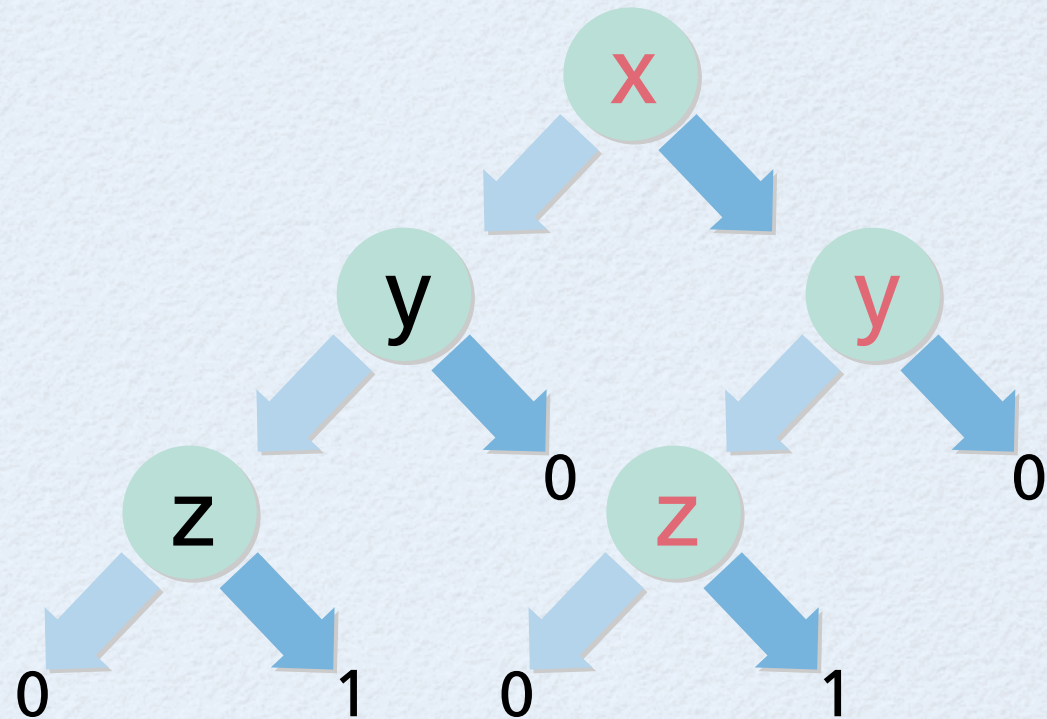
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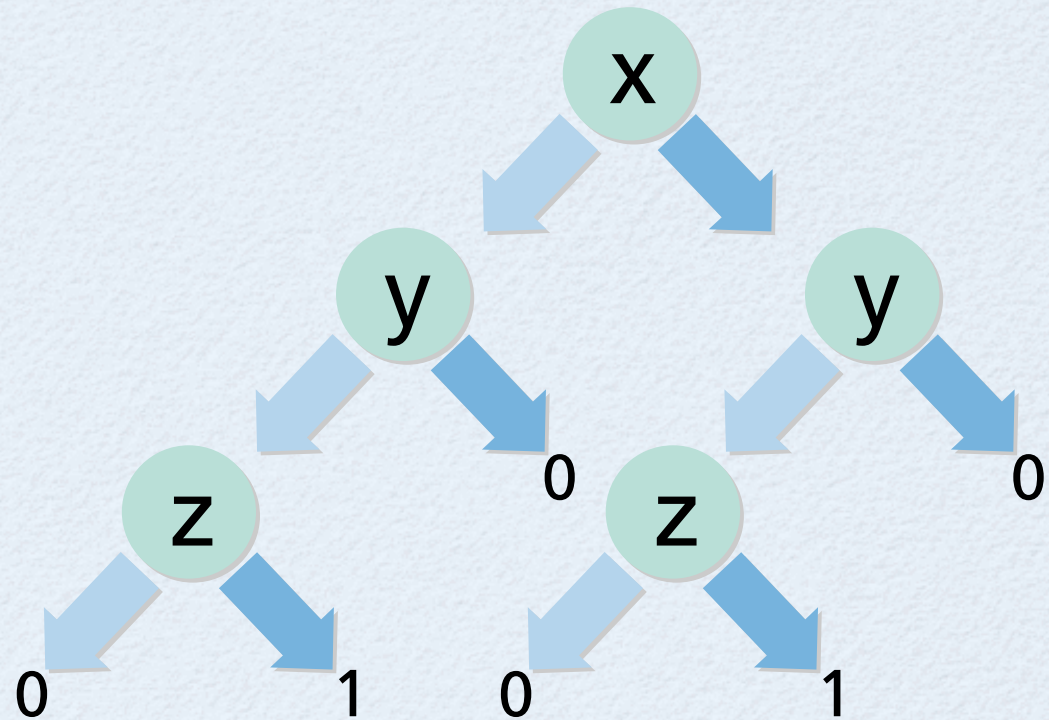
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constant over all paths



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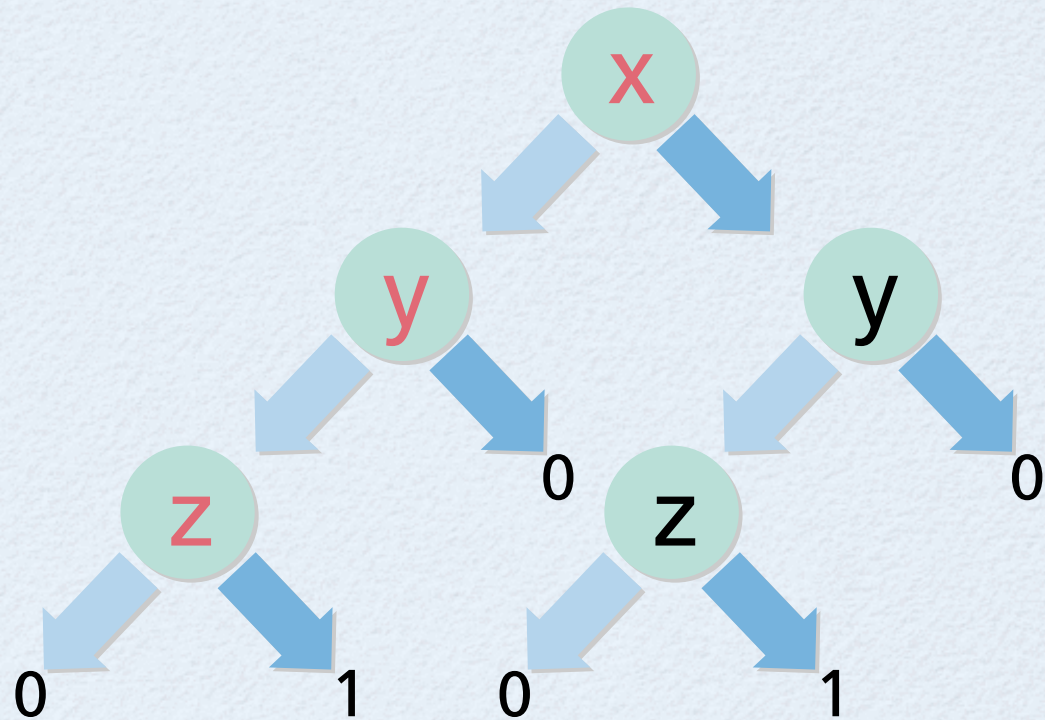
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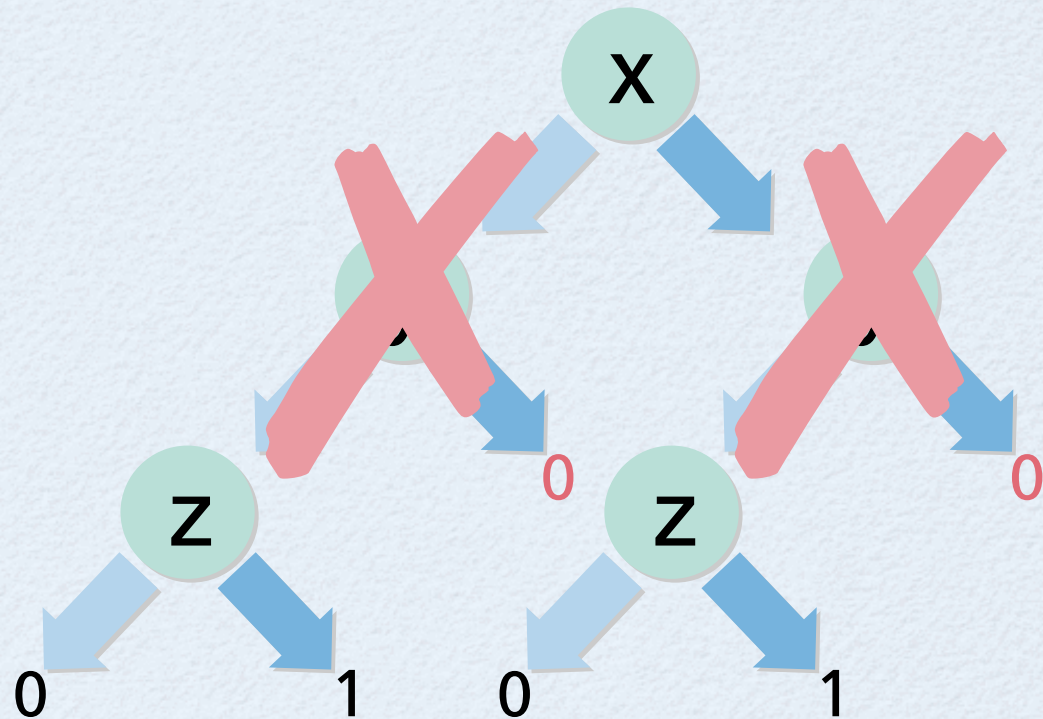
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Zero-suppressed BDD (ZDD)

Node eliminated \iff then $\rightarrow 0$



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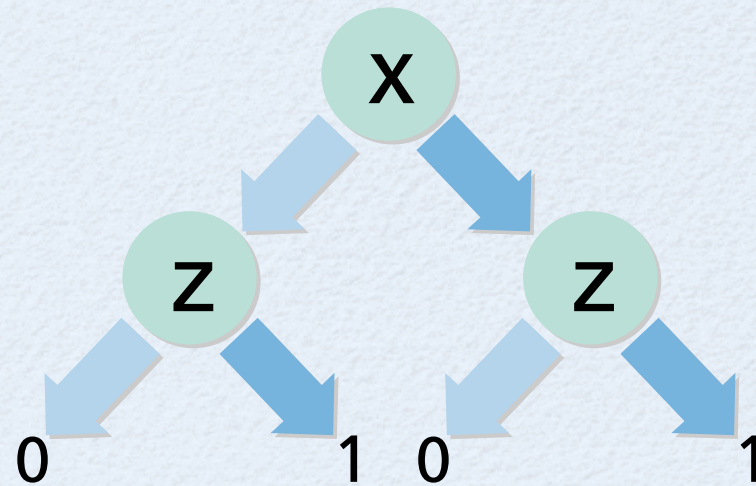
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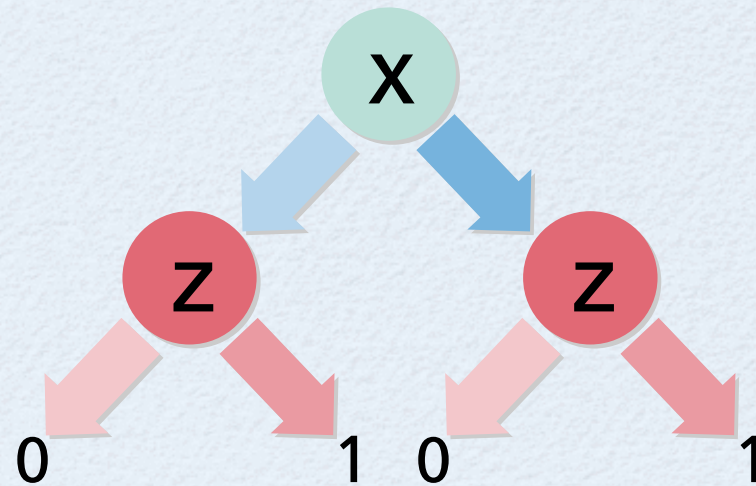
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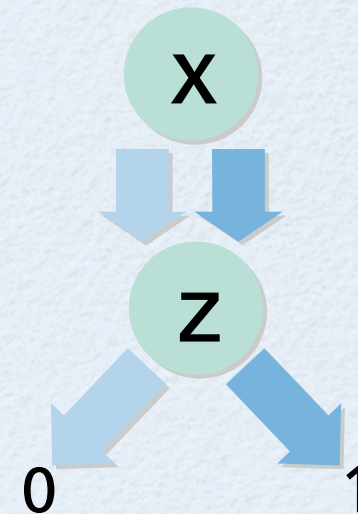
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ADVANTAGES OF ZDDS

Idea

ZDDs store term structure (**not** the Boolean function behind)

Reasons

- Compact data structure
- Suitable for sparse sets of subsets
- Polynomial structure recognizable
 - Valid paths $\hat{=}$ polynomial terms
 - Natural path sequence $\hat{=}$ lexicographical term ordering

POLYNOMIAL ARITHMETIC

Boolean polynomial operations Correspond to set operations

Example

$$(x + xy) + (xy + z) = x + 2xy + z \equiv x + z \iff$$

$$(S_1 \cup S_2) \setminus (S_1 \cap S_2) = \{\{x\}, \{z\}\}$$

$$\text{(with } S_1 = \{\{x\}, \{x, y\}\}, S_2 = \{\{x, y\}, \{z\}\})$$

$$x \cdot (y + z) = xy + yz \iff$$

$$\{\{x\} \cup \{y\}, \{x\} \cup \{z\}\} = \{\{x, y\}, \{x, z\}\}$$

Likewise (but more complicated) Factors/multiples of monomials, degree of a polynomial. . .

ZDD Implementation

Free C/C++ Library Cudd: Fabio Somenzi (University of Colorado)

CACHING AND RECURSION

ZDD normalform

Unique diagram root nodes

$a = b \iff \text{rootnode}(a) \text{ is } \text{rootnode}(b)$

Reference counting

Lower memory usage (no deep copies)

Caching of operations

$a \diamond b$ never evaluated twice (also for sub-diagrams)

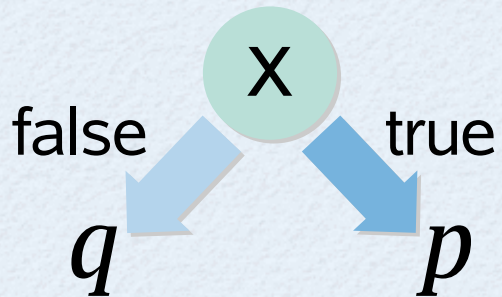
Advantage

Speed-up recursive procedures

CACHING AND RECURSION

Caching and Recursion

Example: $\text{lead}(f)$



$$f = q + x \cdot p$$

First (lexicographical) term t in f with $\deg t = \deg f$.

Input: f Boolean polynomial **Output:** $t = \text{lead}(f)$ (deg-lex)

```
if  $f \in \{0, 1\}$  then  
  set  $t := 1$   
else if  $\text{isCached}(\text{lead}, f)$  then  
  set  $t := \text{cache}(\text{lead}, f)$   
else  
  set  $x := \text{root variable of } f$   
  if  $\deg(f) = \deg(\text{thenBranch}(f)) + 1$  then  
    set  $t := x \cdot \text{lead}(\text{thenBranch}(f))$   
  else  
    set  $t := \text{lead}(\text{elseBranch}(f))$   
  end if  
  insert  $\text{cache}(\text{lead}, f) := t$   
end if
```

FROM ZDDs TO POLYBORI

C++-Library

High-level data types for Boolean polynomials, monomials, exponent vectors, and underlying rings
Implements polynomial operations and basic functionality

ZDDs

Internal handling of polynomial structure
(utilizing cache and uniqueness)

Ordering-dependent functions

Leading term computation, monomial comparisons, ... added

Non-trivial Monomial Orderings
(run- & compile-time selectable)

Lexicographic, degree-lexicographic, and degree-reverse-lexicographic (ascending variable order) orderings
Orderings consisting of blocks of degree-orderings

SINGULAR Interface

Prototype

PYTHON INTERFACE

POLYBORI's Python Interface

Python interface allows for

- Parsing of complex polynomial systems (Inner-domain specific language)
- Interactive use (via ipython)

Extensive testsuite

- Mainly satisfiability examples; some from cryptography

Rapid Prototyping

- Many algorithms existed in python first
- Sophisticated and easy extendable strategies for Gröbner base computation

FIND A ONE OF A BOOLEAN POLYNOMIAL

Input: Boolean polynomial $p \neq 0$

Out: $\{x_i \rightarrow v_i\}_i : p(v_1, \dots, v_k) = 1$

```
if  $p = 1$  then  
    return  $\emptyset$  // empty tuple  
end if  
Set  $r := \text{rootnode}(p)$   
Set  $x := \text{Variable corresponding to } r$   
if  $\text{elseBranch}(r)$  is 0 then  
    Set  $v = 1$   
    Set  $q = \text{thenBranch}(r)$  // plug in 1  
else  
    Set  $v = 0$   
    Set  $q = \text{elseBranch}(r)$  // plug in 0  
end if  
return  $\{x \rightarrow v\} \cup \text{find\_one}(q)$ 
```

SOME APPROACH TO CRYPTOANALYSIS

- many crypto system AES / CTC consists mainly of auxiliary variables and a few key variables
- Eliminate the auxiliary variables and use some other method on the remaining equations in the key variables

EXAMPLE

$k3_0 + s3_0 + s3_1 + s3_2 + s2_0 + s2_1 + s2_2 + s1_0 + s1_1 + s1_2 + s1_3 + k0_0 + 1$
 $k3_1 + s3_1 + s3_2 + s3_3 + s2_1 + s2_2 + s2_3 + s1_1 + s1_2 + s1_3 + k0_1$
 $k3_2 + s3_0 + s3_2 + s3_3 + s2_0 + s2_2 + s2_3 + s1_0 + s1_2 + s1_3 + k0_2$
 $k3_3 + s3_0 + s3_1 + s3_3 + s2_0 + s2_1 + s2_3 + s1_0 + s1_1 + s1_3 + k0_3$
 $k3_4 + s3_4 + s3_5 + s3_6 + s2_4 + s2_5 + s2_6 + s1_4 + s1_5 + s1_6 + k0_4$
 $k3_5 + s3_5 + s3_6 + s3_7 + s2_5 + s2_6 + s2_7 + s1_5 + s1_6 + s1_7 + k0_5 + 1$
 $k3_6 + s3_4 + s3_6 + s3_7 + s2_4 + s2_6 + s2_7 + s1_4 + s1_6 + s1_7 + k0_6 + 1$
 $k3_7 + s3_4 + s3_5 + s3_7 + s2_4 + s2_5 + s2_7 + s1_4 + s1_5 + s1_7 + k0_7$
 $k3_8 + s3_0 + s3_1 + s3_2 + s1_0 + s1_1 + s1_2 + k0_0 + k0_8 + 1$
 $k3_9 + s3_1 + s3_2 + s3_3 + s1_1 + s1_2 + s1_3 + k0_1 + k0_9$
 $k3_{10} + s3_0 + s3_2 + s3_3 + s1_0 + s1_2 + s1_3 + k0_2 + k0_{10} + 1$
 $k3_{11} + s3_0 + s3_1 + s3_3 + s1_0 + s1_1 + s1_3 + k0_3 + k0_{11}$
 $k3_{12} + s3_4 + s3_5 + s3_6 + s1_4 + s1_5 + s1_6 + k0_4 + k0_{12}$
 $k3_{13} + s3_5 + s3_6 + s3_7 + s1_5 + s1_6 + s1_7 + k0_5 + k0_{13}$
 $k3_{14} + s3_4 + s3_6 + s3_7 + s1_4 + s1_6 + s1_7 + k0_6 + k0_{14}$
 $k3_{15} + s3_4 + s3_5 + s3_7 + s1_4 + s1_5 + s1_7 + k0_7 + k0_{15}$
 $k2_0 + s2_0 + s2_1 + s2_2 + s1_0 + s1_1 + s1_2 + k0_0 + 1$
 $k2_1 + s2_1 + s2_2 + s2_3 + s1_1 + s1_2 + s1_3 + k0_1 + 1$
 $k2_2 + s2_0 + s2_2 + s2_3 + s1_0 + s1_2 + s1_3 + k0_2$
 $k2_3 + s2_0 + s2_1 + s2_3 + s1_0 + s1_1 + s1_3 + k0_3$
 $k2_4 + s2_4 + s2_5 + s2_6 + s1_4 + s1_5 + s1_6 + k0_4$
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 $k2_6 + s2_4 + s2_6 + s2_7 + s1_4 + s1_6 + s1_7 + k0_6$
 $k2_7 + s2_4 + s2_5 + s2_7 + s1_4 + s1_5 + s1_7 + k0_7$
 $k2_8 + s2_0 + s2_1 + s2_2 + k0_8$
 $k2_9 + s2_1 + s2_2 + s2_3 + k0_9$
 $k2_{10} + s2_0 + s2_2 + s2_3 + k0_{10} + 1$
 $k2_{11} + s2_0 + s2_1 + s2_3 + k0_{11}$
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 $k2_{14} + s2_4 + s2_6 + s2_7 + k0_{14} + 1$
 $k2_{15} + s2_4 + s2_5 + s2_7 + k0_{15}$
 $k1_0 + s1_0 + s1_1 + s1_2 + k0_0 + 1$
 $k1_1 + s1_1 + s1_2 + s1_3 + k0_1 + 1$
 $k1_2 + s1_0 + s1_2 + s1_3 + k0_2 + 1$
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 $x3_4 + w2_4*w2_5*w2_6 + w2_4*w2_6 + w2_4 + w2_5*w2_6*w2_7 + w2_5*w2_6$
 $x3_5 + w2_4*w2_5*w2_7 + w2_4*w2_5 + w2_4*w2_6 + w2_5*w2_6 + w2_5$
 $x3_6 + w2_4*w2_5 + w2_4*w2_6*w2_7 + w2_4*w2_6 + w2_4*w2_7$

WHY IS IT NATURAL?

- It is easy to formulate equations and reorder variables s.t.
- for each auxiliary variable x we have an equation $x=f$, where f is a polynomial in smaller terms than x , following the encryption algorithm
- these equations form a Gröbner basis allowing reduction of the other polynomials
- only need to calculate a few normals forms

WHAT IS THE PROBLEM

- the new equations, which are normal forms of original ones are incredibly large (measured in the number of terms, size of ZDDs instead depends on some „complexity“)
- need suitable normal form algorithms, that don't depend on the number of terms

SPECIAL NORMAL FORM ALGORITHMS

NORMAL FORM ENCODING

- Problem: „CUDD recursive“ functions on ZDDs have a fixed number of arguments (1,2,3)
- Function normal form $NF(f,G)$ where f is a Boolean polynomial, G is a set of Boolean polynomials
- How to encode G as Polynomial/ZDD?
- Encoding has to lead to a good algorithm

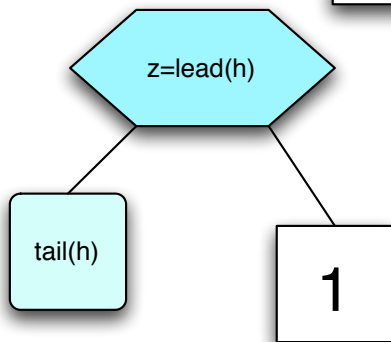
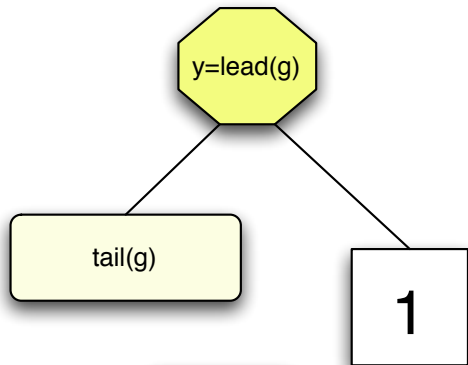
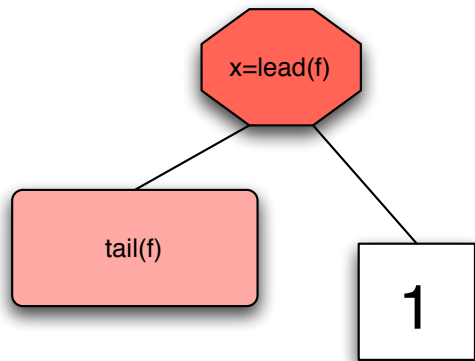
EASIEST CASE: G IS A SET OF MONOMIALS

- A set of monomials G is equivalent to a polynomial where the terms are the members of G
- Normal form calculation means: Cancel every term in f , which is divisible by a term in G
- Example: $f=xy+x+y+xyz$, $G=\{x,zy\}$
 - $NF(f,G)=y$

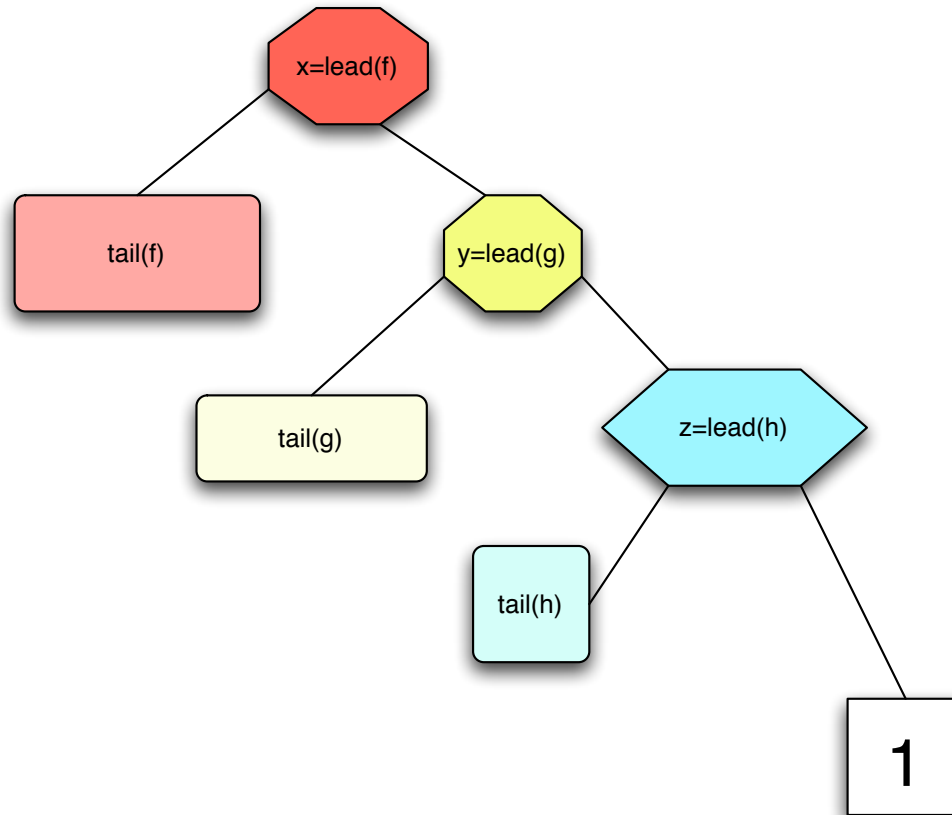
NF(F, SET OF MONOMIALS G)

- if 1 in G: return 0
- if G is zero: return f
- while $\text{rootvarindex}(f) > \text{rootvarindex}(G)$
 - $G = \text{elseBranch}(G)$
- if f is zero or one: return f
- if $\text{rootvarindex}(f) == \text{rootvarindex}(G)$:
 - return $\text{NF}(\text{NF}(\text{thenBranch}(f), \text{elseBranch}(G)), \text{thenBranch}(G))$
 $* \text{rootvar}(f) + \text{NF}(\text{elseBranch}(f), \text{elseBranch}(G))$
- else:
 - return $\text{NF}(\text{elseBranch}(f), G) * \text{NF}(\text{thenBranch}(f), G) * \text{rootvar}(f)$

LINEAR LEADS ENCODING

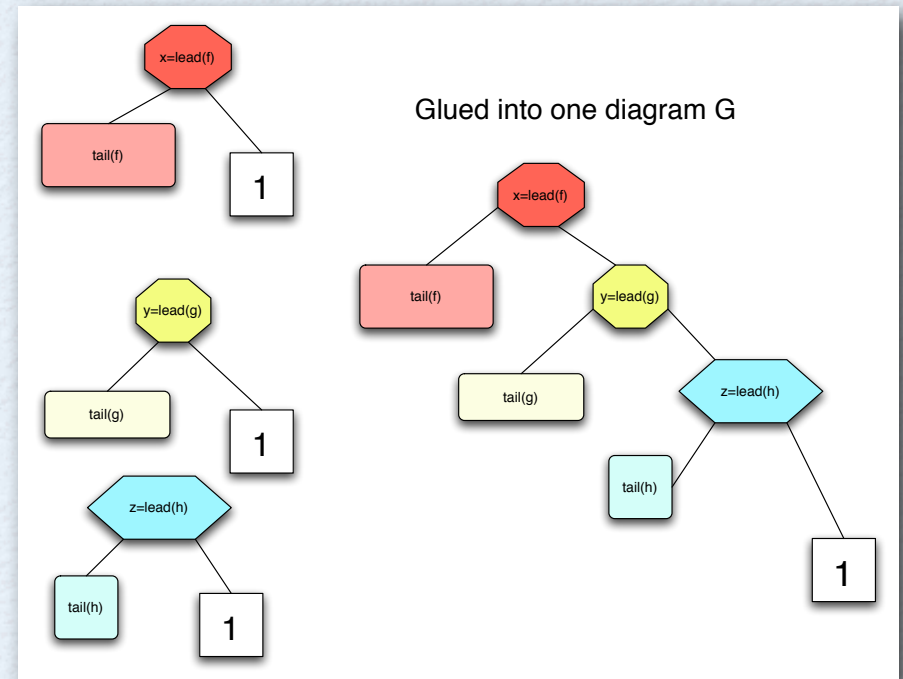


Glued into one diagram G



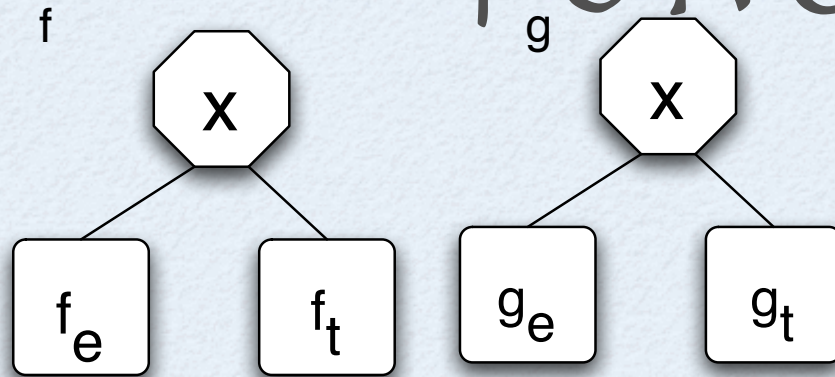
LINEAR LEX LEAD NF(P,G)

- handle terminal cases
- ensure $\text{rootvarindex}(G) = \text{rootvarindex}(p)$
- $\text{next} := \text{thenBranch}(G)$
- return $\text{NF}(\text{elseBranch}(G), \text{next}) * \text{NF}(\text{thenBranch}(p), \text{next}) + \text{NF}(\text{elseBranch}(p), \text{next})$



In the example $G = \{f, g, h\}$

TOWER OF RECURSIVE FUNCTIONS



- $+$: $\text{if_then_else}(x, f_t + g_t, f_e + g_e)$
- $*$: $\text{if_then_else}(x, f_t * g_t + f_e * g_t + f_t * g_e, f_e * g_e)$
- $\text{LLNF}(f, g)$: $g_e * \text{LLNF}(f_t, g_t)$ (linear leads)

INTERPRETATION OF REDUCED NORMAL FORMS W.R.T. LEX ORDERING IN BOOLEAN CASE

- Extend term ordering to ordering on Boolean polynomials by doing string like comparison with terms as literals
- Example: lex $x > y > z$
 - $x + y + z > x + z + 1$
- $\text{redNF}(f, G) = \min\{g \mid g \text{ in } f + \langle G \rangle\}$

NF PROBLEM DECOMPOSITION

- $f = x^*g + h$ // x rootvar of f
- $NF(f, G) = x^*g_n + h_n$
- Then
 - $g_n = \min\{l \mid \text{exists } k: x^*l + k \text{ in } f + \langle G \rangle\}$ // more choice
 - $h_n = \min\{k \mid k + g_n \text{ in } f + \langle G \rangle\}$ // depends on g_n
- These partial problems can be considered separately (Cudd-
recursively)

NORMAL FORM AGAINST AN IDEAL GIVEN BY A BOOLEAN VARIETY $I(V)$

- $g = \text{redNF}(f, I(V)) \iff$
 - $g = \min\{g \mid g \text{ in } f + I(V)\}$
 - $g(x) = f(x)$ for all x in V
- So we have just to know the zeroes and ones of f in V and calculate a minimal interpolation polynomial
- Following the original interpretation of ZDDs as sets of sets, we encode the zeroes of f in I as well as the ones of f in I as ZDDs

MINIMAL INTERPOLATION

- `interpolate_minimal(f,zeroes,ones)`
- $V := \text{zeroes} \cup \text{ones}$
- recursive decomposition
 - $\text{result} = x * g + h$
 - calculate interpolation for g
 - only with prescribed values on `thenBranch(V)`
`intersect(elseBranch(g))`
 - rest of function is adjusted by h

INTERPOLATION NF

number of points	time(interpolation)	len(interpolation)	#basis
100	0.01	52	287
500	0.08	253	1943
1000	0.33	485	3393
5000	5.52	2509	10319
10000	18.99	4992	17868
50000	250.95	25012	82929
100000	897.85	50093	162024

Gröbner basis size can be determined without explicit calculation
random data in 100 variables

POLYBORI AGAINST MINISAT

	Vars./Eqs.		POLYBORI		MiniSat	
hole8	72	297	1.88 s	56.59 MB	0.30 s	2.08 MB
hole9	90	415	8.01 s	84.04 MB	2.31 s	2.35 MB
hole10	110	561	44.40 s	97.68 MB	25.20 s	3.24 MB
hole11	132	738	643.14 s	130.83 MB	782.65 s	7.19 MB
hole12	156	949	10264.92 s	338.66 MB	22920.20 s	17.13 MB

Cracking the famous pigeon hole example by
simple multiplications