
POLYBORI - A Gröbner Basis Framework for Boolean Polynomials



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*Presentation

Basic Data

POLYBORI

*P*olynomials over *B*oolean *R*ings

Website

<http://polybori.sourceforge.net>

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)

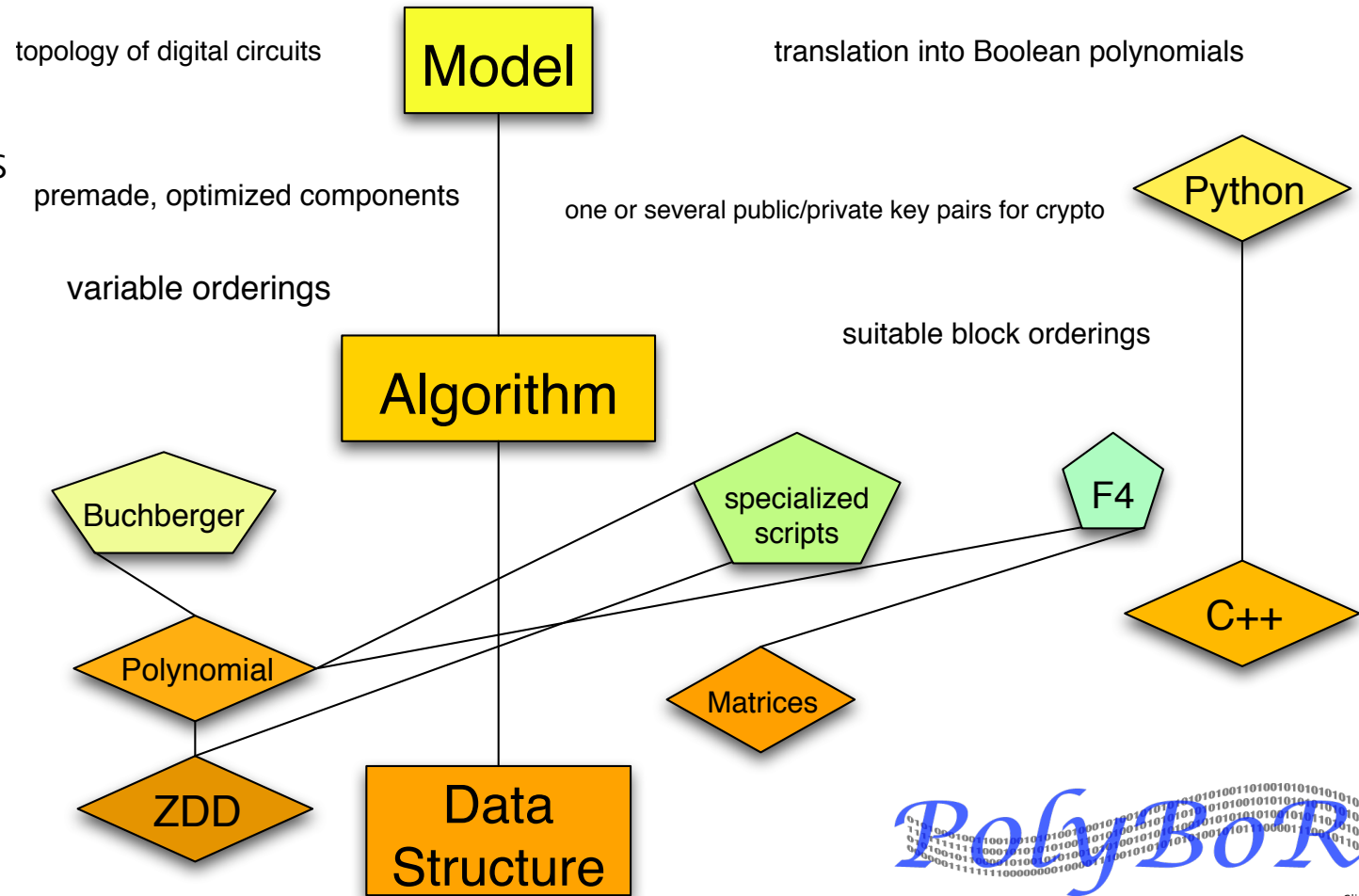
Doctoral thesis

Michael Brickenstein
(Mathematisches Forschungsinstitut Oberwolfach)

Slide 1

Overview

Optimization on many levels



Slide 2

Translation from $\text{GF}(2^r)$ to $\text{GF}(2)$

Identification of fields

$\text{GF}(2^r) \leftrightarrow \text{GF}(2)[a]/\langle m \rangle =: F,$
irreducible $m \in \text{GF}(2)[a]$ with $\deg m = r$



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Identification of rings

$$\text{GF}(2^r)[x_1, \dots, x_n] \leftrightarrow \text{GF}(2)[a][x_1, \dots, x_n]/\langle m \rangle =: P$$

Monomorphism of F -algebras

$$\phi : P \rightarrow P_2, \quad x_i \mapsto \sum_{j=0}^{r-1} y_{i,j} \cdot a^j$$

$$P_2 = F[y_{1,0}, \dots, y_{1,r-1}, y_{2,0}, \dots, y_{2,r-1}, \dots, y_{n,0}, \dots, y_{n,r-1}]$$



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Canonical components f_i

$$\text{Let } f \in P \Rightarrow \exists f_i \in \text{GF}(2)[y_{1,0}, \dots, y_{1,r-1}, y_{2,0}, \dots, y_{n,r-1}] =: Q$$

$$\text{s. th. } \phi(f) = \sum_{i=0}^{r-1} a^i \cdot f_i$$



Translation from $GF(2^r)$ to $GF(2)$

Canonical components

$$\phi(f) = \sum_{i=0}^{r-1} a^i \cdot f_i$$

Map to canonical components

$$\tau : P \rightarrow \text{PowerSet}(Q), \quad f \mapsto \{f_0, \dots, f_{r-1}\}$$



Translation from $\text{GF}(2^r)$ to $\text{GF}(2)$

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Correspondence

$$G = \{g_1, \dots, g_m\} \subset P \leftrightarrow H = \cup_{g \in G} \tau(g) \subset Q$$

Isomorphism of
 $\text{GF}(2)$ -vector spaces

$$\lambda : F^n \rightarrow \text{GF}(2)^{r \cdot n} \quad (F = \text{GF}(2)[a]/\langle m \rangle \hat{=} \text{GF}(2^r))$$

$$a^j \cdot e_i \mapsto E_{(i-1) \cdot r + j + 1}$$



Translation from $\text{GF}(2^r)$ to $\text{GF}(2)$

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Theorem

$$\lambda(\mathbf{V}(G \cup \text{FP}_P)) = \mathbf{V}(H \cup \text{FP}_Q)$$

Field polynomials

$$\text{FP}_P = \{x_1^{2^r} - x_1, \dots, x_n^{2^r} - x_n\},$$

$$\text{FP}_Q = \{y_{i,j}^2 - y_{i,j} \mid 1 \leq i \leq n, 0 \leq j < r\}$$

Describe vanishing points over $\text{GF}(2^r)$ and $\text{GF}(2)$, resp.



Translation from $GF(2^r)$ to $GF(2)$

Disadvantages

- More equations (r times as much)

Advantages

- Simpler base field $GF(2)$
- Lower degree per variable (bound to 1, if FP_Q is omitted)
- Boolean polynomial approach applicable (POLYBORI)

Digital systems verification and Boolean Polynomials

Interprete Boolean expressions as logical operations \rightarrow arithmetical operations and polynomials over \mathbb{Z}_2 $\{true, false\} \rightarrow \{0, 1\}$

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

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Polynomials as sets

$$\begin{aligned} p &= a_1 \cdot x_1^{\nu_{11}} \cdot \dots \cdot x_n^{\nu_{1n}} + \dots + a_{2^n} \cdot x_1^{\nu_{2^n 1}} \cdot \dots \cdot x_n^{\nu_{2^n n}} \\ &= \sum_{s \in S_p} \left(\prod_{x_\nu \in s} x_\nu \right), \end{aligned}$$



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

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

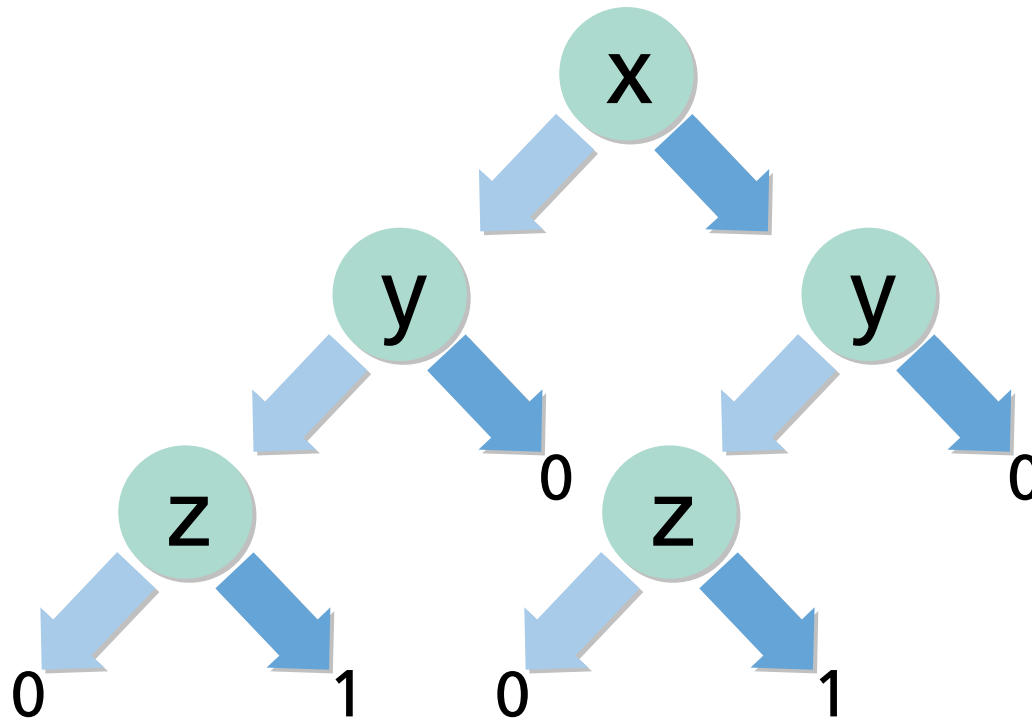
$$\subseteq \text{PowerSet}(x_1, \dots, x_n)$$



Zero-suppressed Binary Decision Diagrams

Binary Decision Diagram

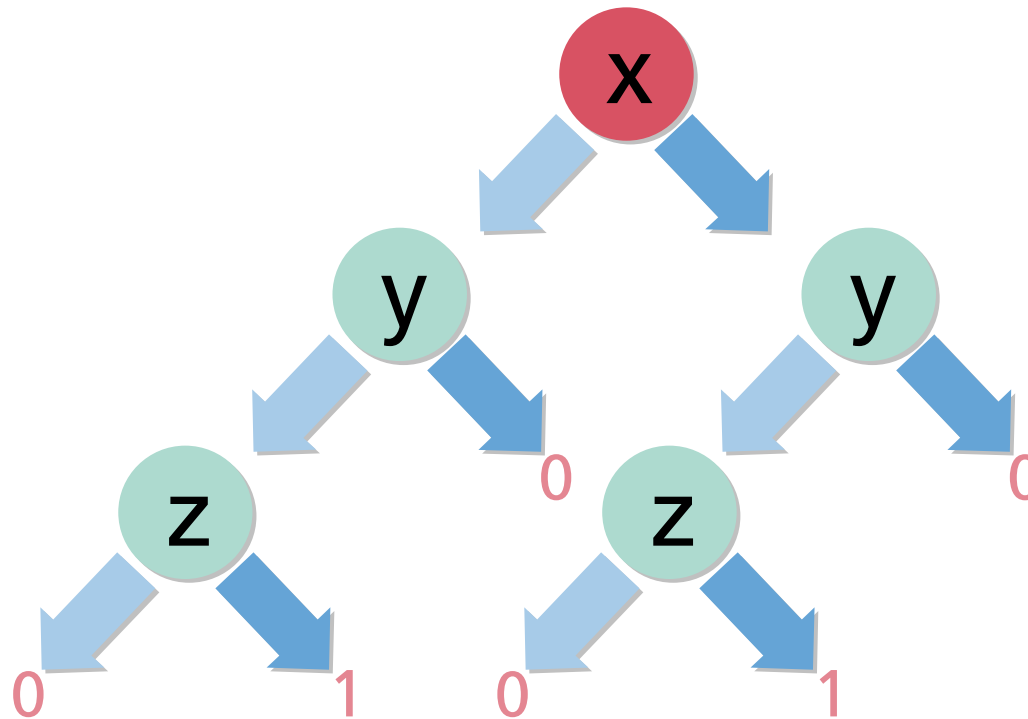
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terminal nodes $\{0, 1\}$, decision
nodes ($\hat{=}$ Boolean variables)



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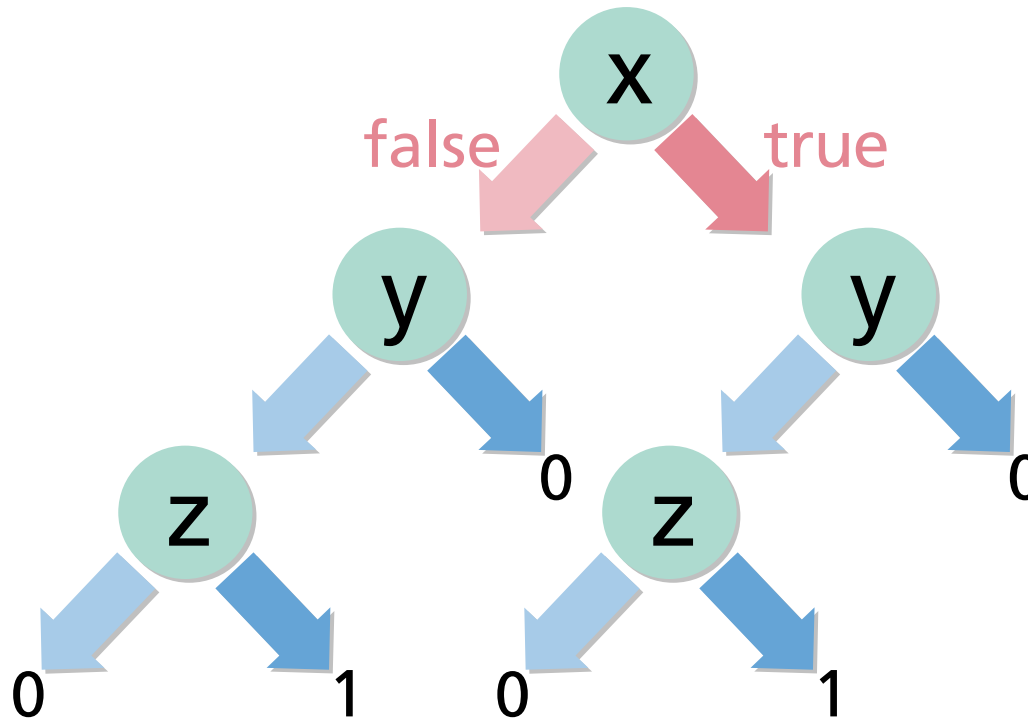
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Two descending edges per node
(high/low or then/else)

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



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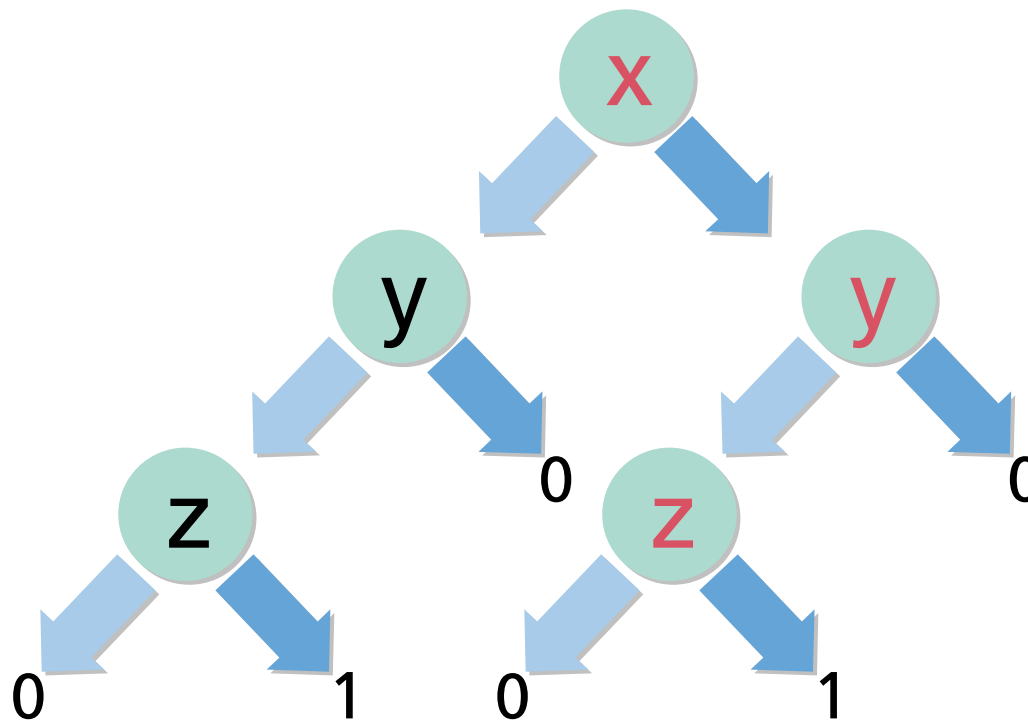
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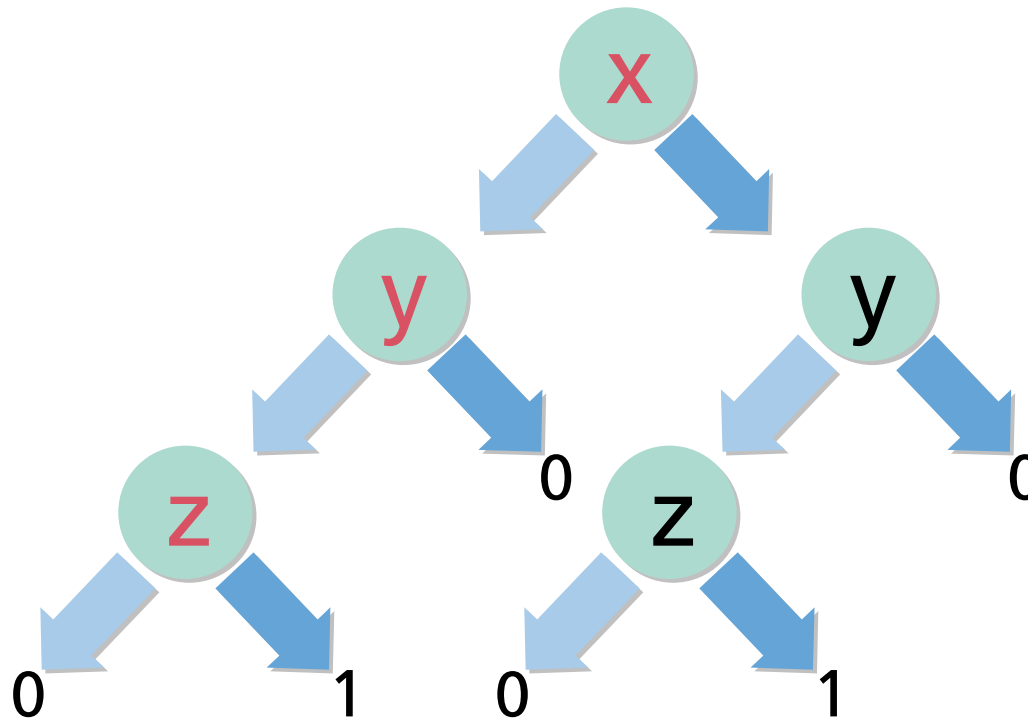
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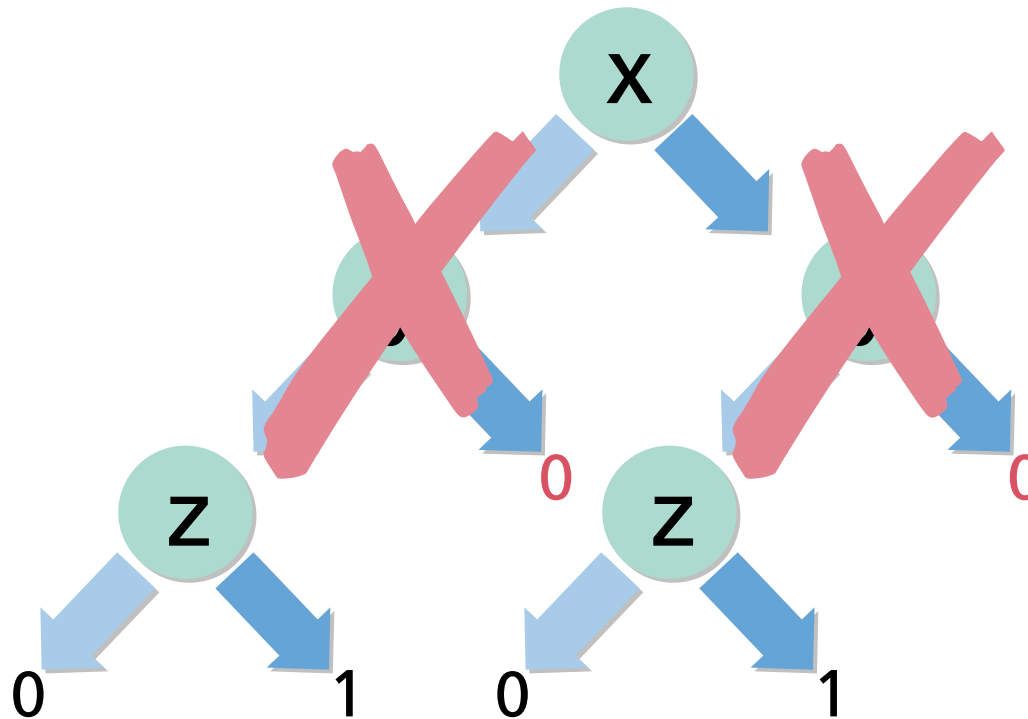
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Node eliminated \iff then $\rightarrow 0$



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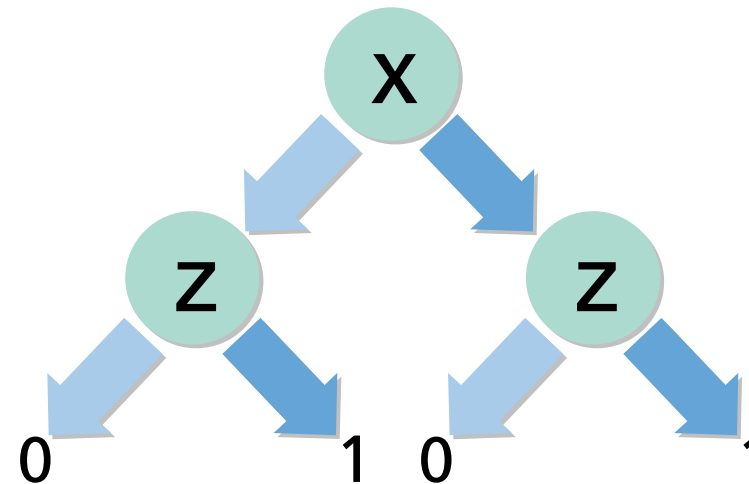
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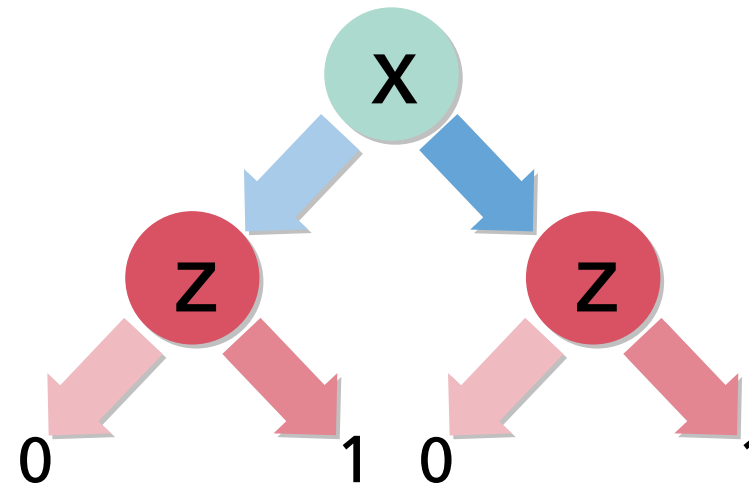
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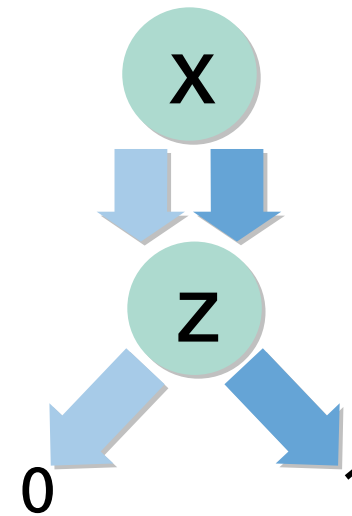
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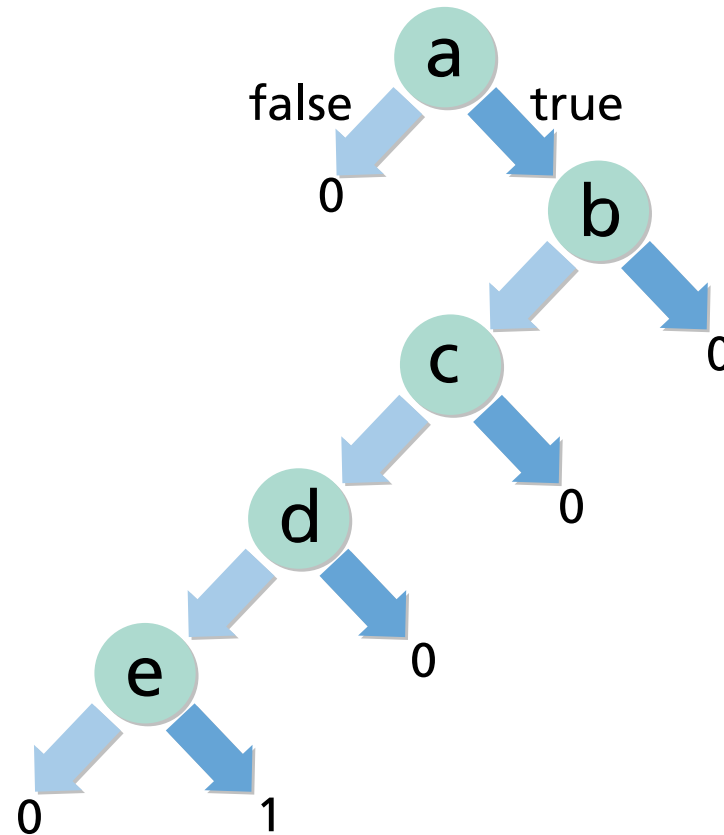
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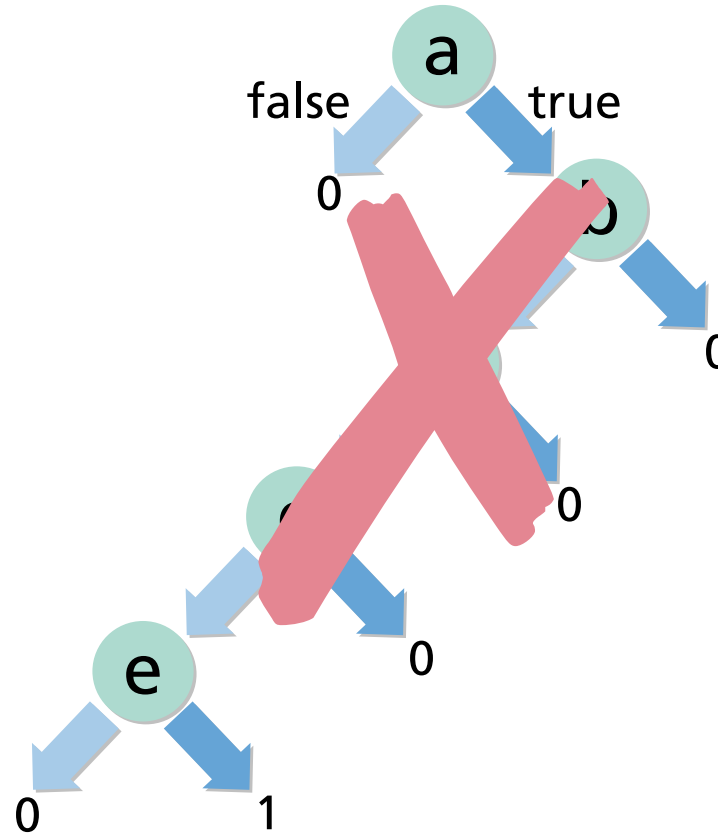
ZDDs for Sparse Sets

Example: $\{\{a, e\}\}$



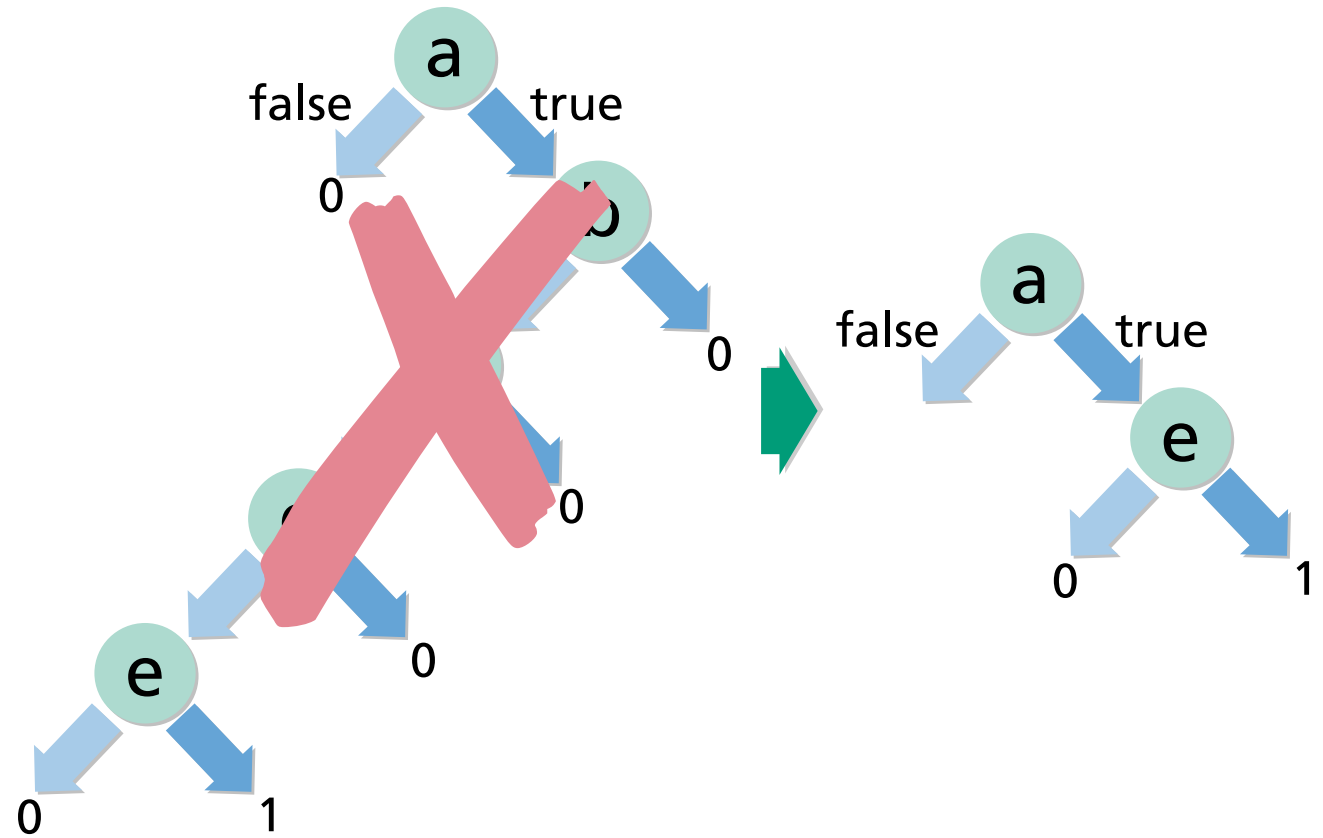
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Slide 8



Advantages of ZDDs

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

Advantages of ZDDs

- Idea
- ZDDs store term structure (**not** the Boolean function behind)
- Reasons
- Compact data structure
 - Suitable for sparse and structured subsets of power sets

Boolean Polynomials as ZDDs

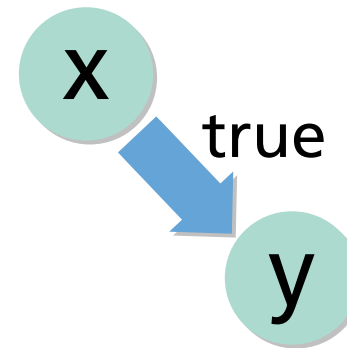
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$$x y + x + z \hat{=} \{\{x, y\}, \{x\}, \{z\}\}$$

Boolean Polynomials as ZDDs

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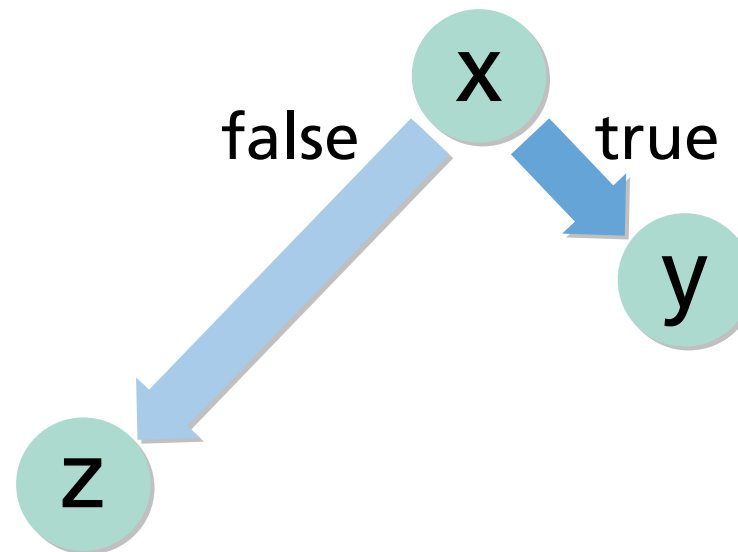
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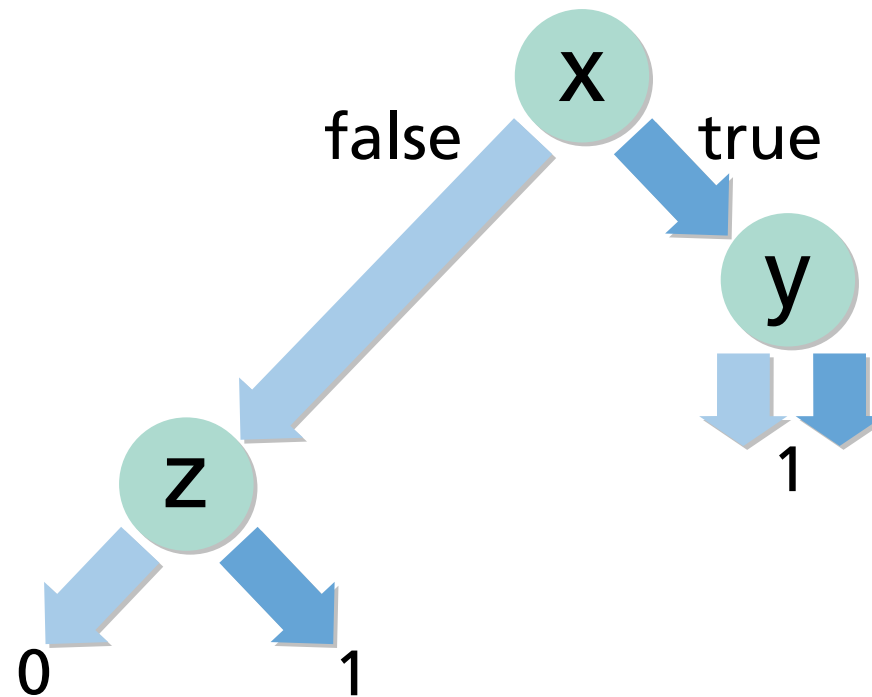
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Boolean Polynomials as ZDDs

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Polynomial Arithmetic

Boolean polynomial operations

Correspond to set operations

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Example

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

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

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



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

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Boolean polynomial operations

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

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

Likewise (but more complicated)

Factors/multiples of monomials, degree of a polynomial. . .

ZDD Implementation

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

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

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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

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Interfaces www.sagemath.org
singular.mathematik.uni-kl.de

SAGE (python code compatible; community-made)
SINGULAR (Prototype)

Slide 12

Data Structures

Polynomial Ring
(tiny excerpt)

Generates base components

Ordering (runtime changeable)

Active ring (shared pointer) based
on decision diagram manager

```
class BoolePolyRing {
public:
    // ...
    BoolePolyRing(size_type nvars, ordercode_type order = lp);

    dd_type variable(idx_type i) const; // i-th variable
    dd_type zero() const;              // Constant polynomials
    dd_type one() const;

    size_type nVariables() const;

    void changeOrdering(ordercode_type);

protected:
    manager_ptr pMgr;
    // ...
};
```

Data Structures

Example
(tiny excerpt)

```
class BoolePolynomial {  
public:  
    // ...  
    BoolePolynomial();           // Default constructor  
    BoolePolynomial(bool_type); // Construct from 0 or 1
```

Object-oriented operations

```
    self& operator+=(const self&); // Arithmetical operations  
    self& operator*=(const self&);
```

High-level abstractions

```
    bool operator==(const self&) const; // Logical operations  
    bool operator!=(const self&) const;
```

Likewise for monomials,
variables, and exponent vector

```
    monom_type lead() const;           // Get leading term  
    size_type deg() const;             // Degree of the polynomial  
    monom_type usedVariables() const;  
    // ... various term access functions ...  
private:  
    dd_type m_dd;                      // Actual decision diagram  
};
```



Term-access Functions

Forward iterator over terms

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const_iterator begin() const;  
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Compile-time selected ordering

```
<order>_iterator genericBegin(<order>_tag) const;  
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Iterator-like structure for navigation over ZDD nodes

```
navigator navigation() const;  
incrementThen(), incrementElse() replacing operator++()
```

POLYBORI's Python Interface

Python interface allows for

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

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Extensive testsuite

- Mainly satisfiability examples; some from cryptography

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- Many algorithms existed in python first

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Rapid Prototyping

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

Python Interface (Data Format)

Script level

Easy input and handling of complex polynomial systems

```
declare_ring([
    AlternatingBlock(["c", "s"], 56, start_index=1, reverse=True),
    AlternatingBlock(["a", "b"], 8, reverse=True),
], globals())

ideal = [
    a(0)*b(1)*a(1)*b(0)+c(1),
    a(0)*b(1)+a(1)*b(0)+s(1),
    a(1)*b(1)*a(2)*b(0)+c(3)
]

ideal = function(ideal);
```

Several variants for Gröber base computation

Comparison of Storage Types for Boolean Polynomials

Tune strategies and heuristics to strengths of underlying data structure!

	ZDD	linked list	buckets ¹	factory ²
leading term	++ 0 - ³	++	+	+(close ZDD)
p1 + p2	++	+	++	0
tail(p) ⁴	-	++	+	0
redNF(p,m)	++	0	-	--
canonicalize	++	+	--	+
memory use	++ ⁵	+	-	--
iteration	0 ⁶	++	--	-(see ZDD)
p1 * p2	++ ⁷	+	--	+
factorize	++	-	--	++

- 1) partly reduced container 2) recursive expression
 3) lex | special cases | general case 4) often during reduction with monomial
 5) every substructure stored once
 6) possible, but ordering-dependent 7) automatically reduced

Caching and Recursion

ZDD normalform

Unique diagram root nodes

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

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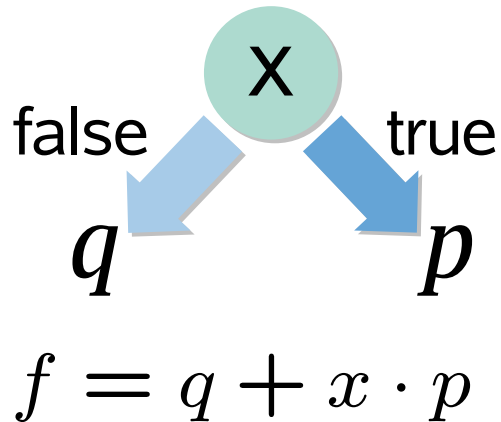
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Advantage

Speed-up recursive procedures

Caching and Recursion

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



Input: f Boolean polynomial

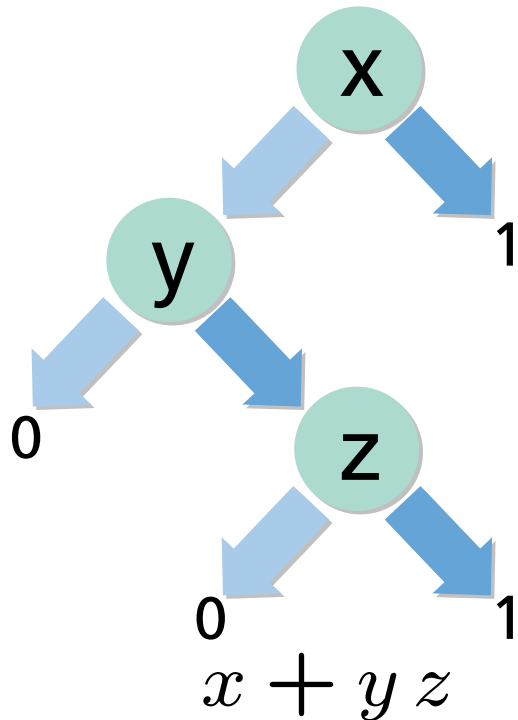
Output: $d = \text{deg}(f)$

```

if  $f \in \{0, 1\}$  then
  set  $d := 0$ 
else if  $\text{isCached}(\text{deg}, f)$  then
  set  $d := \text{cache}(\text{deg}, f)$ 
else
  set  $d := \max(\text{deg}(\text{thenBranch}(f)) + 1,$ 
                 $\text{deg}(\text{elseBranch}(f)))$ 
  insert  $\text{cache}(\text{deg}, f) := d$ 
end if
    
```

Caching and Recursion

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



Input: f Boolean polynomial

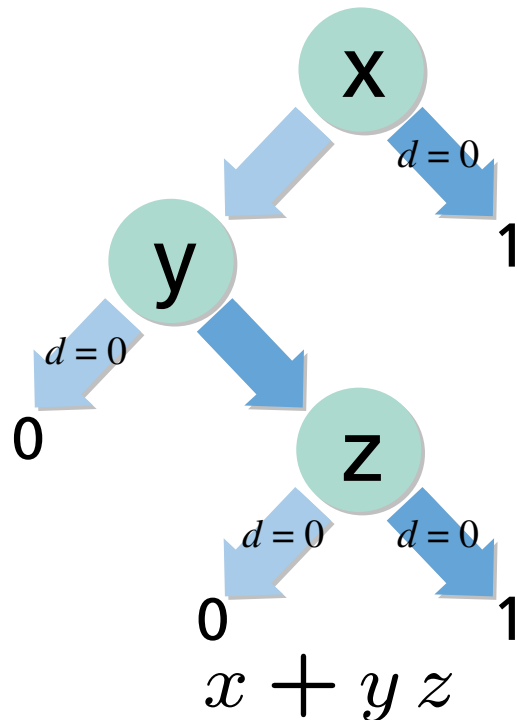
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```

if  $f \in \{0, 1\}$  then
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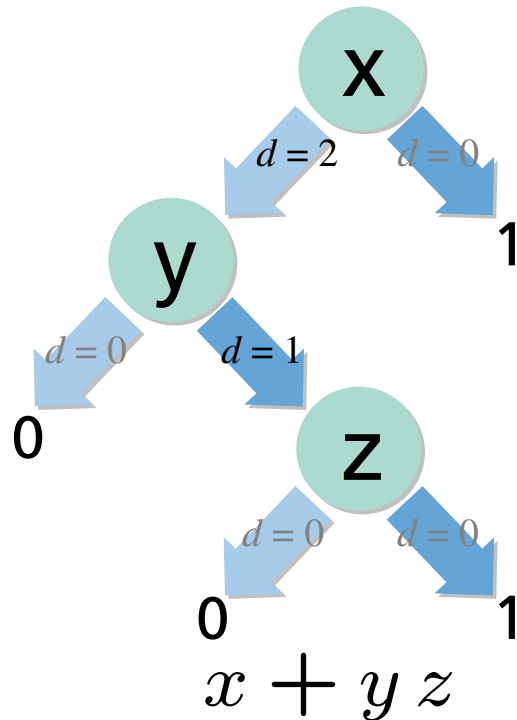
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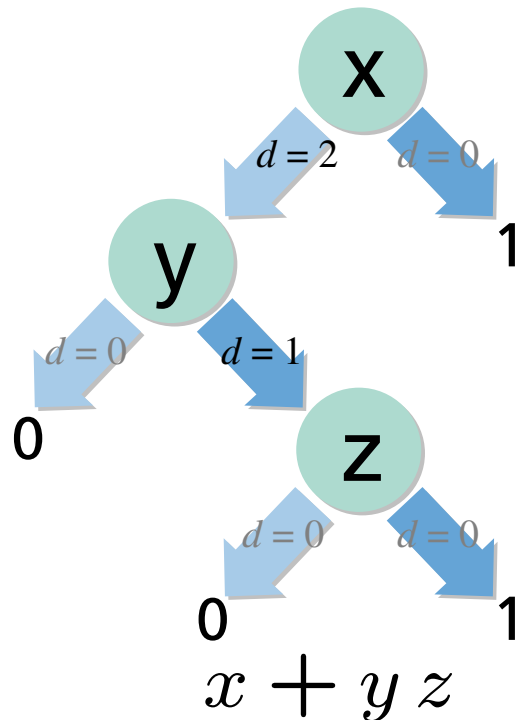
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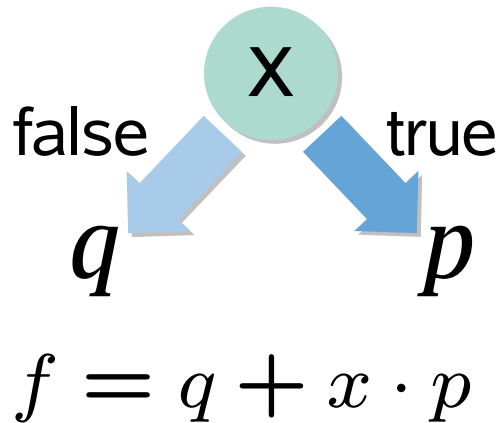
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- Reuse for polynomials with likewise structure.
- Fast access to intermediate results by other functions.

Caching and Recursion

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



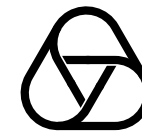
First (lexicographical) term t in f with $\deg t = \deg f$.

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

```

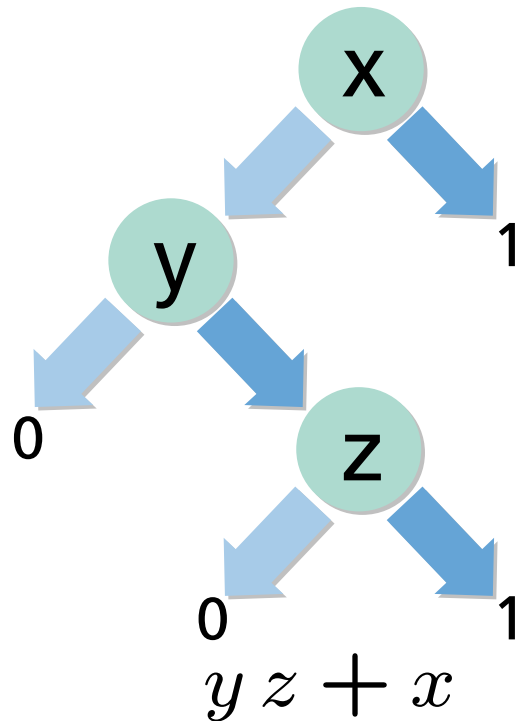
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Caching and Recursion

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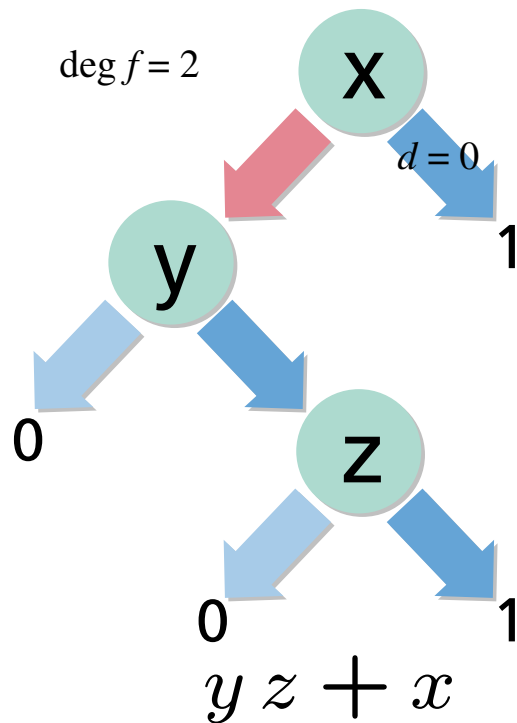
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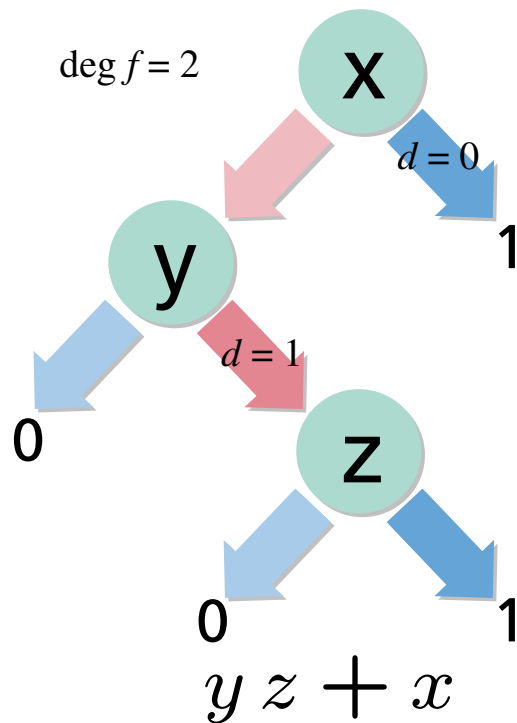
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Boolean Polynomials and Logical Expressions

- Propositional logic \rightarrow Boolean polynomial
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Property Checking

- Digital system given as set R of Boolean polynomials
- Property p (Boolean expression) to be verified w. r. t. R
- Check via normal form computation: $NF(p, R) = 0$?

Gröbner Basis

- Let $G = \{g_1, \dots, g_m\}$ be (multivariate) polynomials
- Define an ordering $>$ on the monomials of $K[x_1, \dots, x_m]$
- For a polynomial p define $\text{lead}(p)$ the biggest monomial occurring in p

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Examples

- $\langle G \rangle$ is the whole ring, then $G \ni 1$
- $\{x_1 - c_1, \dots, x_n - c_n\}$ for a (radical) ideal with unique solution c_1, \dots, c_n

Linear Lead-Rewriting System

System of Boolean polynomials

– $G = \{g_1, \dots, g_m\}$ in variables x_1, \dots, x_n

Suppose, the following holds:

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Example:

$$G = \{x - 1, y - 1\}, p = x \cdot y \cdot z \rightarrow \text{NF}(p, R) = z$$



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- A digital circuit is described by a linear lead rewriting system
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- $R := \{e_j | o_j \text{ output signal}\} \cup \{x_i^2 + x_i | i = 1, \dots, n\}$
- For the system described by this equations, we would like to check a property p , which is given as Boolean expression
- Check via normal form computation: $NF(p, R) = 0?$

Representation of Adder Blocks with Carry Bit

Variables

$s(0), \dots, s(n-1)$ (sums), $c(0), \dots, c(n-1)$ (carry bits),
 $a(0), \dots, a(n-1), b(0), \dots, b(n-1)$ (inputs)

Topological Variable Order

$s(n-1), c(n-1), a(n-1), b(n-1),$
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Outputs before inputs, a, b reverse alternating (fast ZDD handling)

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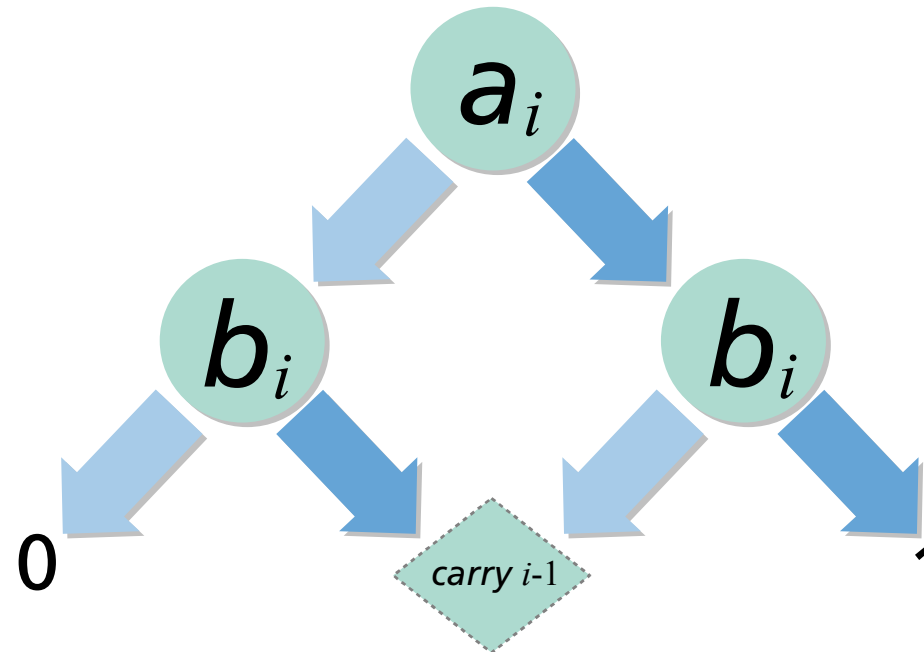
Equations

$c(i) + carry_i$
 $s(i) + a(i) + b(i) + carry_i$

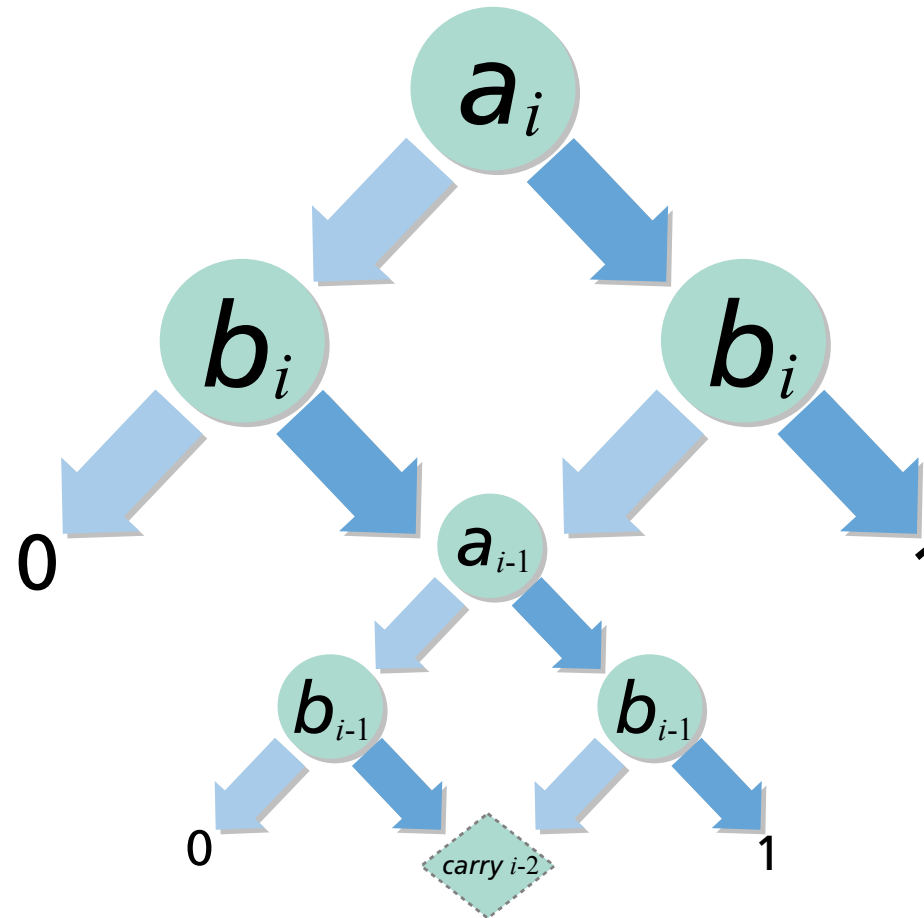
with $carry_{-1} = 0$
 and $carry_i = a(i) \cdot (b(i) + carry_{i-1}) + b(i) \cdot carry_{i-1}$



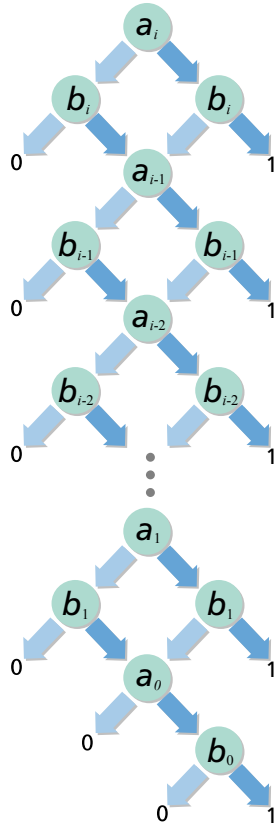
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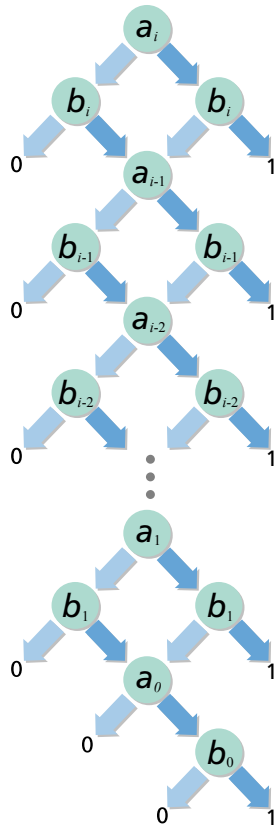
Carry-Bit Graph



i-th bit	terms	nodes
1	1	2
2	3	5
3	7	8
4	15	11
5	31	14
6	63	17
7	127	20
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9	511	26
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n	$2^n - 1$	$3n - 1$

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- Linear growth of ZDDs (plaited structure)
- Fast generation and arithmetic operations

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Demo: $n = 4096$

Application: Abstract 4096-Bit Adder and Logic

```
adder_bits=4096
adder_block=AdderBlock(sums="s", carries="c",
                      input1="a", input2="b",
                      adder_bits=adder_bits, start_index=1)

declare_ring([Block("x", 100), adder_block, Block("y", 100)])
ideal=[
  y(0)+y(1)+1,
  a(adder_bits)+1, b(adder_bits)+y(0)+y(1),
  x(0)+(c(adder_bits))*x(1)
]
adder_block.implement(ideal)

claims=[
  c(adder_bits)+1,
  if_then([x(1)], [x(0)]),
  if_then([a(1), b(1)], [c(1), s(1)]),
  if_then([a(1)+1], [c(1)+b(1), s(1)+b(1)+1]),
  s(adder_bits)+c(adder_bits-1),
  x(33)
]
```



Counter Example for Failed Claims

- A claim c fails $\iff q := \text{NF}(c, R) \neq 0$
- A Boolean polynomial is 0 \iff it is 0 as a function

Algorithm

Boolean polynomial q reduced w. r. t. R , R red. Gröbner basis

$\text{Variables}(q) \subseteq V := \{x_1, \dots, x_n\} \setminus \{\text{Leading Terms}(R)\}$

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Theorem

v_1, \dots, v_n provides a valid counter example

Slide 30



Benchmarks: Pigeon Hole Problems

	Vars./Eqs.		POLYBORI		MiniSat	
hole6	42	133	0.13 s	51.64 MB	0.01 s	1.96 MB
hole7	56	204	0.46 s	51.89 MB	0.06 s	1.96 MB
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

Remark

Good performance mainly due to fast Boolean multiplication



Benchmarks: Lex. Normalform Computations without Gröbner basis

	#	smallest lex.		interpolate simple		#
	points	time/1 s	length	time/1 s	length	basis
Interpolation vs. Gröbner approaches	100	0.01	42	0.00	12771	287
	500	0.06	249	$0.01 \approx 2.9 \cdot 10^{10}$		1943
	1000	0.29	508	$0.01 \approx 8.1 \cdot 10^{13}$		3393
	5000	5.53	2552	$1.47 \approx 4.5 \cdot 10^{23}$		10319
	10000	19.78	5020	$37.18 \approx 1.6 \cdot 10^{26}$		17868
	50000	250.95	25012			82929
	100000	897.85	50093			162024
	200000	3488.61	99868			296697
	500000	20336.02	249675			636542

Remark

Normalform w. r. t. Boolean functions, given by points in \mathbb{Z}_2^n
 Gröbner basis sizes calculated without explicit basis computation

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- Optimized setup of arithmetic components (adder)