

Синтез на основе синтаксиса (Syntax-guided synthesis)

Чухарев Константин // Университет ИТМО





Syntax-guided synthesis (SyGuS)

Chukharev Konstantin // ITMO University

This logo should also be in English...



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### Syntax-Guided Program Synthesis

$$\exists f \in \mathrm{Exp.} \, \forall x. \, \mathrm{Spec}(f,x)$$

**Spec** – logical formula that captures the desired functionality of f

$$(f(x,y) \geq x) \wedge (f(x,y) \geq y) \wedge (f(x,y) \in \{x,y\})$$
 [Semantics]

 $\mathbf{Exp}$  – set of expressions specified by a context-free grammar that captures the candidate implementations of  $\mathbf{f}$ 





### **Applications**

- > Programming by examples (PBE)
  - Given some inputs and outputs, find a desired function
- > Superoptimizing compiler
  - Replace code with more efficient (yet equivalent!) code
- > Side-channel attacks on cryptographic circuits
- > Template-guided invariant generation
- > ... many more ...





### Programming by Examples (PBE)

```
A ::= 0 | 1 | x | (bvnot A)
     | (shl1 A) | (shr1 A) | (shr4 A) | (shr16 A)
                                                                         Examples
       (bvand A A) | (bvor A A) | (bvxor A A)
                                                                          (inputs and outputs)
       (bvadd A A) | (if0 A A A)
                                           ∃f.
                                            f(\#x28085a970e13e12c) = \#x28085a970e13e12d
Grammar
                                            f(\#xbe5341bebd2a0749) = \#xbe5341bebd2a0749
                                            f(\#xcd67bd5beaac575e) = \#xcd67bd5beaac575e
                 f := \lambda x.
  Solution
                 (if0 (bvand (bvnot x) #x0000000000000001)
  (size = 29)
                 (if0 (bvand (bvnot (shr4 x)) #x0000000000000001)
                 (if0 (bvand (shr1 (shr16 x)) #x0000000000000001)
                 (if0 (bvand (bvnot (shr1 x)) #x00000000000000) (bvor #x00000000000000 x) x)
                 (if0 (bvand (bvnot (shr1 x)) #x0000000000000001) x
                 (if0 (bvand (shr16 x) #x000000000000000) x (bvor #x00000000000000 x))))
                 (if0 (bvand (shr1 (shr16 x)) #x000000000000000) (bvor #x00000000000000 x) x))
                 (bvor #x000000000000001 x))
```



### Superoptimizing Compiler

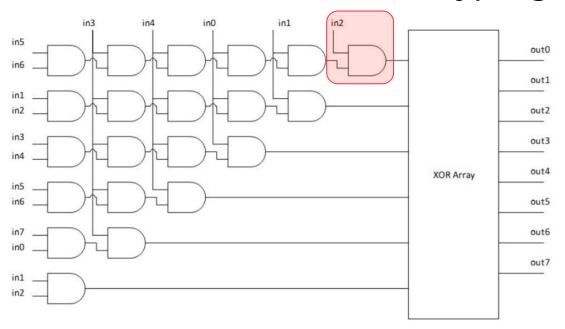
```
multiply (x[1,n], y[1,n]) {
  x1 = x[1,n/2];
  x2 = x[n/2+1, n];
  y1 = y[1, n/2];
  y2 = y[n/2+1, n];
  a = x1 * v1;
 b = shift(x1 * y2, n/2);
  c = shift(x2 * y1, n/2);
  d = shift(x2 * y2, n);
  return (a + b + c + d)
```

Replace with equivalent code with only 3 multiplications





### Side-channel Attacks on Cryptographic Circuits



#### **Countermeasures:**

- 1. Add delays to inputs
- 2. Auto-synthesize
  - the equivalent circuit (semantic constraint),
  - where all input-to-output paths have the same length (syntactic constraint)



Ghalaty, N.F. Analyzing and eliminating the causes of fault sensitivity analysis, 2014. DOI: 10.7873/date.2014.217.



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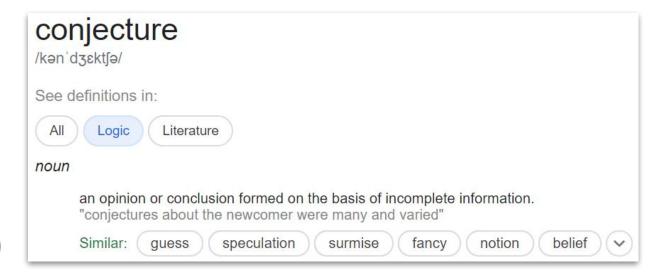




### Synthesis Conjectures

$$\exists f. \, \forall x. \, P(f,x)$$

"There exists a function f for which property P holds for all x"







### Synthesis Conjectures Modulo T

$$\exists f.\, orall x.\, P(f,x)$$

"There exists a function f for which property P holds for all x"

#### **Property** is in some **background theory** *T*, for example:

- Linear or non-linear arithmetics (LIA, NIA)
- Fixed-width bit-vectors (BV)
- Strings
- **—** ...
- ⇒ Satisfiability Modulo Theories (SMT)





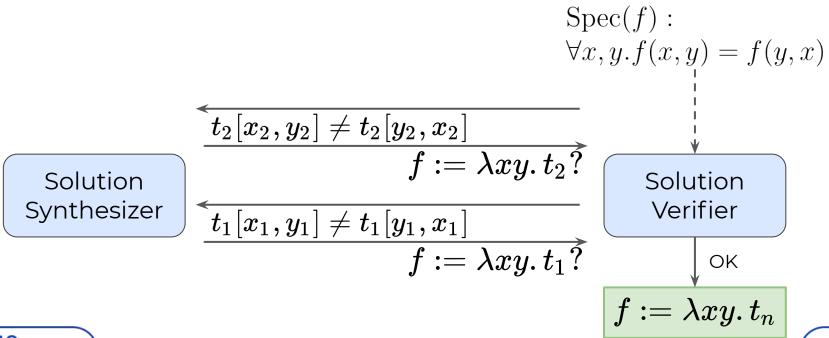
### Approaches to Synthesis

- Naïve
  - Let f free uninterpreted function (UF)
  - Use SMT solvers to find a model for f
  - Hard for SMT solvers :c
- Counterexample-guided Inductive Synthesis (CEGIS)
  - Enumerative
  - Symbolic
  - Stochastic
- Counterexample-guided quantifier instantiation (CEGQI)
  - https://doi.org/10.1007/978-3-319-21668-3\_12





### Counterexample-guided Inductive Synthesis (CEGIS)





#### **Enumerative CEGIS**

```
Syntax(f):
                                                                    \operatorname{Spec}(f):
A ::= A+A \mid -A \mid x \mid y \mid 0 \mid 1 \mid ite(B,A,A)
                                                                    \forall x, y. f(x, y) = f(y, x) + f(0, 1)
B ::= B \land B \mid \neg B \mid A = A \mid A > A \mid \bot
                                                        f := \lambda xy. 0?
                              f(\mathbf{2},\mathbf{1}) \neq f(\mathbf{1},\mathbf{2}) + f(0,1)
          Solution
                                                                                     Solution
                                                        f := \lambda xy. y?
                                                                                      Verifier
       Enumerator
                              f(0,1) \neq f(1,0) + f(0,1)
                                                                                             OK
                                                        f := \lambda xy. x?
                                                                                  f := \lambda xy.0
```



### **Enumerative CEGIS + Unification**

```
Syntax(f):
```

$$A ::= A+A \mid -A \mid x \mid y \mid 0 \mid 1 \mid ite(B,A,A)$$

$$\mathtt{B} \; ::= \; \mathtt{B} \wedge \mathtt{B} \; \mid \; \neg \mathtt{B} \; \mid \; \mathtt{A} {=} \mathtt{A} \; \mid \; \mathtt{A} {\geq} \mathtt{A} \; \mid \; \bot$$

Spec
$$(f)$$
:  $\forall x, y. f(x, y) = f(y, x)$ 

Syntax-Guided Enumeration

$$\downarrow t_1, t_2, \ldots, t_n$$

Unification Algorithm

$$f:=\lambda xy.\,u[\ldots,t_i,\ldots,t_j,\ldots]$$

Solution Verifier





### **CEGIS** using SMT Solver

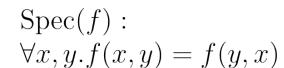
```
Syntax(f):
```

 $A ::= A+A \mid -A \mid x \mid y \mid 0 \mid 1 \mid ite(B,A,A)$ 

 $\mathtt{B} \; ::= \; \mathtt{B} \wedge \mathtt{B} \; \mid \; \neg \mathtt{B} \; \mid \; \mathtt{A} = \mathtt{A} \; \mid \; \mathtt{A} \geq \mathtt{A} \; \mid \; \bot$ 

Syntax-Guided Enumeration

> Unification Algorithm



Solution Verifier

**SMT Solver** 





#### **CEGIS** inside an SMT Solver

```
Syntax(f):
```

 $A ::= A+A \mid -A \mid x \mid y \mid 0 \mid 1 \mid ite(B,A,A)$ 

 $B ::= B \land B \mid \neg B \mid A = A \mid A > A \mid \bot$ 

 $\operatorname{Spec}(f)$ :  $\forall x, y. f(x, y) = f(y, x)$ 

Syntax-Guided Enumeration

**SMT Solver** (CVC4)

Unification Algorithm

Solution Verifier





### **Enumerative Synthesis in SMT Solvers**

 $synth(\exists f. \forall x. P(f,x))$ :

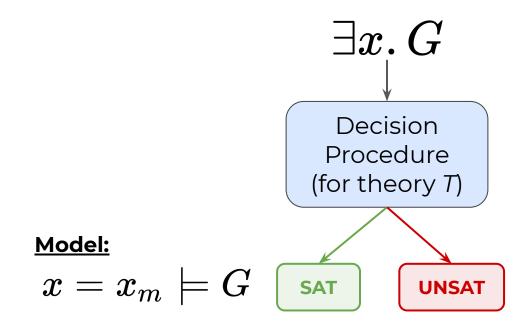
- 1. Syntax-guided enumeration
  - Gonstruct a set of "interesting" terms {t₁ ... tո}
- 2. Unification algorithms (<a href="https://doi.org/10.1007/978-3-662-54577-5\_18">https://doi.org/10.1007/978-3-662-54577-5\_18</a>)
  - $\downarrow$  From  $\{t_1 \dots t_n\}$ , construct candidate u for f
- 3. (Decision) Procedures
  - □ Check whether *u* satisfies the specification:

"Is 
$$\neg \forall x . P(u, x) T$$
-unsatisfiable?"  $\Rightarrow \neg P(u, x_m)$ 





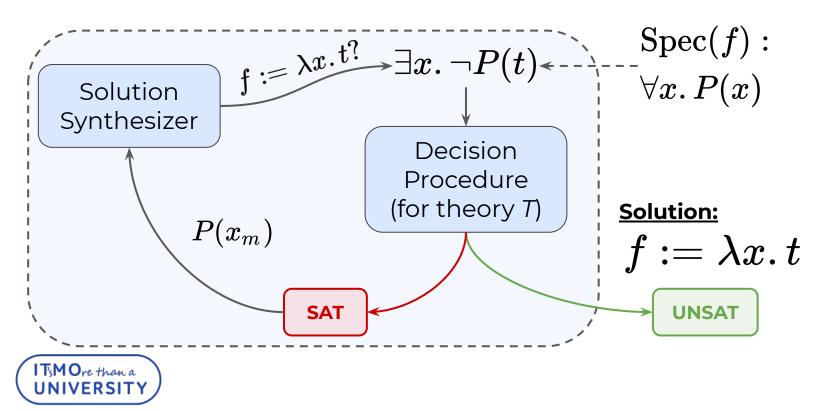
### From Decision Procedures to Synthesis Procedures







### From Decision Procedures to Synthesis Procedures





Ufff... Enough theory.

# Demo time





#### Links

- https://sygus.org/
  - SyGuS specification: <a href="https://sygus.org/assets/pdf/SyGuS-IF\_2.0.pdf">https://sygus.org/assets/pdf/SyGuS-IF\_2.0.pdf</a>
- https://cvc4.github.io/
  - Online playground: <a href="https://cvc4.github.io/app">https://cvc4.github.io/app</a>
- http://smtlib.cs.uiowa.edu/
  - Logics: <a href="http://smtlib.cs.uiowa.edu/logics.shtml">http://smtlib.cs.uiowa.edu/logics.shtml</a>
  - SMT specification: <a href="http://smtlib.cs.uiowa.edu/language.shtml">http://smtlib.cs.uiowa.edu/language.shtml</a>
- **>** ...





### (Minimal) Boolean Formula Synthesis

```
(synth-fun f ((x Bool) (y Bool) (z Bool)) Bool
    ((Start Bool)) (
    (Start Bool (
                                  ; f(x,y,z) = x | (y\&z) = 00011111
        X Y Z
        (not Start)
                                  (constraint (= (f' 0 0 0) 0))
        (and Start Start)
                                  (constraint (= (f' 0 0 1) 0 ))
                                   (constraint (= (f' 0 1 0) 0 ))
        (or Start Start)
                                   (constraint (= (f' 0 1 1) 1 ))
    ))
                                   (constraint (= (f' 1 0 0) 1 ))
                                   (constraint (= (f' 1 0 1) 1 ))
                                   (constraint (= (f' 1 1 0) 1))
https://gist.github.com/Lipen/1bb
f6586ad180ef8334a5e5a7efa1576
                                   (constraint (= (f' 1 1 1) 1))
                                  ; Solution: (or x (and y z))
```

## Thanks for your attention.

kchukharev@itmo.ru



