

Interprocedural Analysis and Context Sensitivity

Announcements

- HW2?
- Submittity page still not open... Will test toy programs

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Outline of Today's Class

- Overview of homework
- Catch-up: Class analysis
- XTA
- O-CFA
- Points-to Analysis (PTA)

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XTA

\mathbf{R} is the set of **reachable methods**

\mathbf{S}_m is the set of **types** that flow to method \mathbf{m}

\mathbf{S}_f is the set of **types** that flow to field \mathbf{f}

1. $\{ \text{main} \} \subseteq \mathbf{R}$
2. for each method $\mathbf{m} \in \mathbf{R}$ and each **new site new C** in \mathbf{m}
 $\{ \mathbf{C} \} \subseteq \mathbf{S}_m$

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XTA

3. for each method $\mathbf{m} \in \mathbf{R}$, each **virtual call** $\mathbf{y.n(z)}$ in \mathbf{m} , each class \mathbf{C} in $\text{SubTypes}(\text{StaticType}(\mathbf{y})) \cap \mathbf{S}_m$ and \mathbf{n}' , where $\mathbf{n}' = \text{resolve}(\mathbf{C}, \mathbf{n})$

$\{ \mathbf{n}' \} \subseteq \mathbf{R}$ // add \mathbf{n}' to \mathbf{R} if not already there

$\{ \mathbf{C} \} \subseteq \mathbf{S}_{\mathbf{n}'}$ // add \mathbf{C} to $\mathbf{S}_{\mathbf{n}'}$ if not already there

$\mathbf{S}_m \cap \text{SubTypes}(\text{StaticType}(\mathbf{p})) \subseteq \mathbf{S}_{\mathbf{n}'}$

$\mathbf{S}_{\mathbf{n}'} \cap \text{SubTypes}(\text{StaticType}(\text{ret})) \subseteq \mathbf{S}_m$

(\mathbf{p} denotes the parameter of \mathbf{n}' , and ret denotes the return of \mathbf{n}')

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XTA

4. for each method $\mathbf{m} \in \mathbf{R}$, each **field read** $\mathbf{x = y.f}$ in \mathbf{m}

$\mathbf{S}_f \subseteq \mathbf{S}_m$

5. for each method $\mathbf{m} \in \mathbf{R}$, each **field write** $\mathbf{x.f = y}$ in \mathbf{m}

$\mathbf{S}_m \cap \text{SubTypes}(\text{StaticType}(\mathbf{f})) \subseteq \mathbf{S}_f$

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Practical Concerns

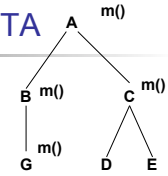
- Multiple parameters
 - Direct calls
 - either **static invoke** calls or
 - special invoke** calls
 - Array reads and writes!
 - Static fields
- See Tip and Palsberg for more

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Example: RTA vs. XTA

```
public class A {
  public static void main() {
    n1();
    n2();
  }
  static void n1() {
    A a1 = new B(); // Sn1 approximates locals in n1
    a1.m();         // Sn1 = { B }
  }
  static void n2() {
    A a2 = new C(); // Sn2 approximates locals in n2
    a2.m();         // Sn2 = { C }
  }
}
```



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Boolean Expression Hierarchy: RTA vs. XTA

```
public class AndExp extends BoolExp {
  private BoolExp left;
  private BoolExp right;

  public AndExp(BoolExp left, BoolExp right) {
    this.left = left;
    this.right = right;
  }
  public boolean evaluate(Context c) {
    private BoolExp l = this.left;
    private BoolExp r = this.right;
    return l.evaluate(c) && r.evaluate(c);
  }
}
```

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Boolean Expression Hierarchy: RTA vs. XTA

```
public class OrExp extends BoolExp {
  private BoolExp left;
  private BoolExp right;

  public OrExp(BoolExp left, BoolExp right) {
    this.left = left;
    this.right = right;
  }
  public boolean evaluate(Context c) {
    private BoolExp l = this.left;
    private BoolExp r = this.right;
    return l.evaluate(c) || r.evaluate(c);
  }
}
```

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Boolean Expression Hierarchy: RTA vs. XTA

```
main() {
  Context theContext = new Context();
  BoolExp x = new VarExp("X");
  BoolExp y = new VarExp("Y");
  BoolExp exp = new AndExp(
    new Constant(true), new OrExp(x, y) );
  theContext.assign(x, true);
  theContext.assign(y, false);
  boolean result = exp.evaluate(theContext);
}
```

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0-CFA

- 0-CFA stands for 0-level Control Flow Analysis, where "0-level" stands for **context-insensitive** analysis
 - Will see 1-CFA, 2-CFA, ... k-CFA
- Improves on XTA by storing even more information about flow of class types

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0-CFA

R is the set of **reachable methods**

S_v is the set of **types** that flow to **variable v**

S_f is the set of **types** that flow to field **f**

1. $\{ \text{main} \} \subseteq R$
2. for each method $m \in R$ and each **new site** $x = \text{new } C$ in m
 $\{ C \} \subseteq S_x$

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0-CFA

3. for each method $m \in R$, each **virtual call** $x = y.n(z)$ in m , each class C in S_y and n' , where $n' = \text{resolve}(C, n)$

$\{ n' \} \subseteq R$

$\{ C \} \subseteq S_{\text{this}}$

$S_z \cap \text{SubTypes}(\text{StaticType}(p)) \subseteq S_p$

$S_{\text{ret}} \cap \text{SubTypes}(\text{StaticType}(x)) \subseteq S_x$

(this is the implicit parameter of n' , p is the parameter of n' , and ret is the return of n')

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0-CFA

4. for each method $m \in R$, each **field read** $x = y.f$ in m

$S_f \cap \text{SubTypes}(\text{StaticType}(x)) \subseteq S_x$

5. for each method $m \in R$, each **field write** $x.f = y$ in m

$S_y \cap \text{SubTypes}(\text{StaticType}(f)) \subseteq S_f$

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0-CFA

6. for each method $m \in R$, each **assign stmt** $x = y$ in m

$S_y \cap \text{SubTypes}(\text{StaticType}(x)) \subseteq S_x$

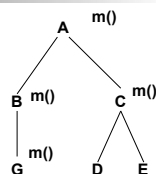
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Example: XTA vs. 0-CFA

```
public class A {
  public static void main() {
    A a1 = new B();
    a1.m();

    A a2 = new C();
    a2.m();
  }
}
```



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Boolean Expression Hierarchy: XTA vs. 0-CFA

```
main() {
  Context theContext = new Context();
  BoolExp x = new VarExp("X");
  BoolExp y = new VarExp("Y");
  BoolExp exp = new AndExp(
    new Constant(true), new OrExp(x, y) );
  theContext.assign(x, true);
  theContext.assign(y, false);
  boolean result = exp.evaluate(theContext);
}
```

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Boolean Expression Hierarchy: XTA vs. 0-CFA

```

public class OrExp extends BoolExp {
    private BoolExp left;
    private BoolExp right;

    public OrExp(BoolExp left, BoolExp right) {
        this.left = left;
        this.right = right;
    }
    public boolean evaluate(Context c) {
        private BoolExp l = this.left;
        private BoolExp r = this.right;
        return l.evaluate(c) || r.evaluate(c);
    }
}

```

$S_{OrExp.left(field)} = \{ VarExp \}$
 $S_{OrExp.right(field)} = \{ VarExp \}$

$S_{l(local)} = \{ VarExp \}$
 $S_{r(local)} = \{ VarExp \}$

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PTA

- Widely referred to as Andersen's points-to analysis for Java
- Improves on 0-CFA by storing information about **objects**, not classes
 - A a1 = new A(); // $o_1 \dots o_1.f$
 - A a2 = new A(); // $o_2 \dots o_2.f$

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PTA

- R** is the set of **reachable methods**
- pts(v)** is the set of **objects** that **v** may point to
- pts(o.f)** is the set of **objects** that field **f** of object **o** may point to
1. { main } $\in R$
 2. for each method $m \in R$ and each **new site** $i: x = \text{new } C$ in m
 - { o_i } $\in \text{pts}(x)$ // instead of **C**, we have o_i

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PTA

3. for each method $m \in R$, each **virtual call** $x = y.n(z)$ in m , each class o_i in **pts(y)** and n' , where $n' = \text{resolve}(\text{class_of}(o_i), n)$
- $\text{class_of}(o)$ returns the class of object **o**
- { n' } $\in R$
 - { o_i } $\in \text{pts}(\text{this})$
 - $\text{pts}(z) \cap \text{SubTypes}(\text{StaticType}(p)) \subseteq \text{pts}(p)$
 - $\text{pts}(\text{ret}) \cap \text{SubTypes}(\text{StaticType}(x)) \subseteq \text{pts}(x)$
- (**this** is the implicit parameter of n' , **p** is the parameter of n' , and **ret** is the return of n')

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PTA

4. for each method $m \in R$, each **field read** $x = y.f$ in m
 - for each object $o \in \text{pts}(y)$
 - $\text{pts}(o.f) \cap \text{SubTypes}(\text{StaticType}(x)) \subseteq \text{pts}(x)$
5. for each method $m \in R$, each **field write** $x.f = y$ in m
 - for each object $o \in \text{pts}(x)$
 - $\text{pts}(y) \cap \text{SubTypes}(\text{StaticType}(f)) \subseteq \text{pts}(o.f)$

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PTA

6. for each method $m \in R$, each **assign stmt** $x = y$ in m
 - $\text{pts}(y) \cap \text{SubTypes}(\text{StaticType}(x)) \subseteq \text{pts}(x)$

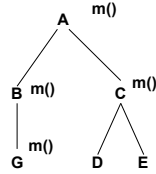
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Example: 0-CFA vs. PTA

```
public class A {
  public static void main() {
    X x1 = new X(); // o1
    A a1 = new B(); // o2
    x1.f = a1; // o1.f points to o2
    A a2 = x1.f; // a2 points to o2
    a2.m();

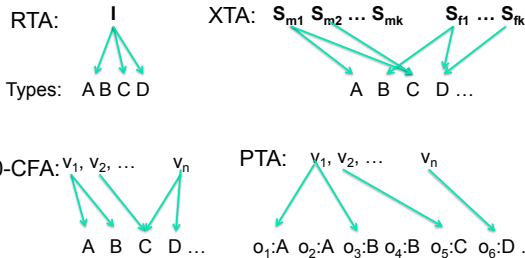
    X x2 = new X(); // o3
    A a3 = new C(); // o4
    x2.f = a3; // o3.f points to o4 equiv. pts(o3.f) = { o4 }
    A a4 = x2.f; // a4 points to o4
    a4.m();
  }
}
```



The Big Picture

- All fit into our monotone dataflow framework!
- Flow-insensitive, context-insensitive
 - Least solution of $S = f_i(S) \vee S$
- Algorithms differ mainly in “size” of S
 - RTA: only 2 kinds of statements; Lattice?
 - XTA: expands to all statements; Lattice?
 - 0-CFA: all statements; Lattice?
 - PTA (Points-to analysis): all statements; Lattice elements are points-to graphs

The Big Picture



Outline of Today's Class

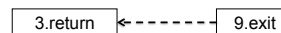
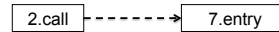
- Interprocedural Control Flow Graph (ICFG)
 - Realizable paths, Meet-Over-all-Realizable-Paths (MORP) solution
 - Also denoted as MVP or MRP
- Classical results on interprocedural analysis
 - Call-string approach
 - Functional approach
- Context-sensitive analysis in practice

Outline of Today's Class

- Reading:
 - Sharir and Pnueli, “Two approaches to interprocedural dataflow analysis”, 1981
- Chapter 12.1-3 Dragon book

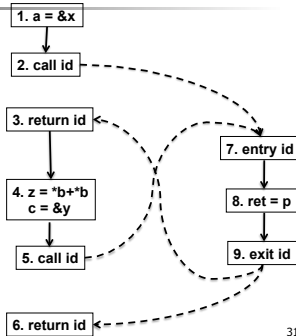
Interprocedural Control Flow Graph (ICFG)

- Add procedure **entry** node and **exit** node
- At each procedure call add
 - A **call** node, and a **call-entry** edge
- A **return** node, and an **exit-return** edge



Interprocedural Control Flow Graph (ICFG)

```
int* id(int* p) {
    return p;
} ...
a = &x;
c1: b = id(a);
z = *b + *b;
c = &y;
c2: d = id(c);
```



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Context-Insensitive Analysis

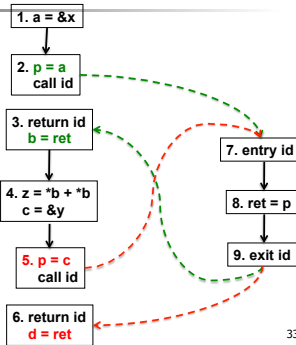
- Add explicit assignments at call/return
 - E.g., $x = id(y)$
 - $p = y$ models flow from actuals to formals
 - $x = ret$ models flow from return to lhs
- Treat ICFG as one big CFG, and apply worklist algorithm
- Problem: merges data from different contexts
- Goal: track “realizable paths”. **Context-sensitive** analysis tracks “realizable paths”

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Infeasible Paths

```
int* id(int* p) {
    return p;
}
a = &x;
c1: b = id(a);
z = *b + *b;
c = &y;
c2: d = id(c);
```

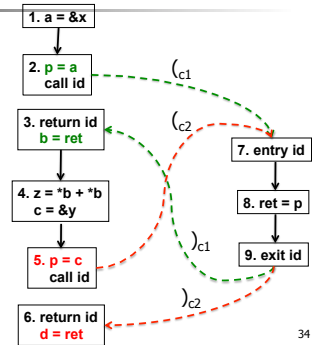


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Realizable Paths

```
int* id(int* p) {
    return p;
}
a = &x;
c1: b = id(a);
z = *b + *b;
c = &y;
c2: d = id(c);
```



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Another Example

```
int fib(int z, int u) {
    if (z < 3) {
        return u+1;
    } else {
        c2: v = fib(z-1, u);
        c3: return fib(z-2, v);
    }
} ...
c1: y = fib(x, 0);
```

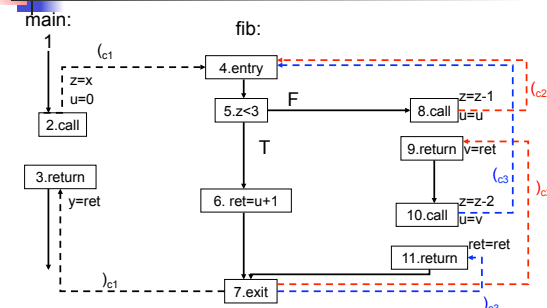
/ ret = u+1; auxiliary variable ret holds the return values */*

What does **fib** compute? Here **z** and **u** are formal parameters; **ret** is the special variable holding the return value.

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Another Example



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Realizable Paths (RP)

- Context-free grammar!
- Same-level (balanced) path (SLP):

$$M ::= e \quad e \text{ denotes intraprocedural edge}$$

$$| (c_i M)_{c_i} \quad \text{captures path from call to return}$$

$$| M M$$
 - An intraprocedural edge is annotated with e
 - Call edge that originates at call site c_i is $(c_i$
 - Corresponding return edge is $)_{c_i}$
- A path p , from m to n , is in $SLP_{m,n}$ iff string along p is in language described by M

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Realizable Paths (RP)

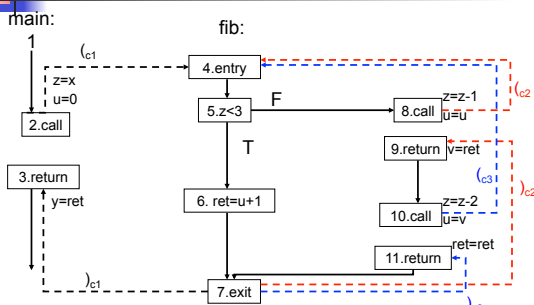
- Another grammar, describes paths with outstanding calls (i.e., calls not yet returned):

$$C ::= (c_i | M (c_i | C M$$
- A path from entry node 1 to node n is in $RP_{1,n}$ iff the string from 1 to n is in the language generated by either M or C
 - E.g., in `fib`, `1,2,4,5,6,7` is in RP but `1,2,4,5,8,4,5,6,7,3` is not in RP

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Is $p_1 = 1,2,4,5,6,7$ in RP ?
 Is $p_2 = 1,2,4,5,8,4,5,6,7,3$ in RP ?



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Meet Over All Realizable Paths (MORP)

- $MORP(n) = \bigvee f_{n_k} \circ f_{n_{k-1}} \circ \dots \circ f_{n_2} \circ f_1(\text{init})$
 - $p = (1, n_2, \dots, n_k, n)$ is a path in $RP_{1,n}$
 - \circ denotes function composition
 - Also called MVP (meet over all **valid** paths) or just MRP
- $MORP(n) \leq MOP(n)$. Why?
- May be undecidable even for lattices of finite height
- Goal: **encode context** and restrict analysis over realizable paths, as much as possible

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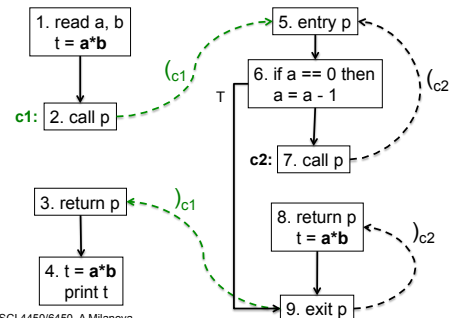
Classic Results and Ideas

- Sharir and Pnueli's "Two approaches to Interprocedural dataflow analysis", 1981
 - Amir Pnueli, Turing Award in 1996 for "For seminal work introducing temporal logic into computing science and for outstanding contributions to **program and system verification**."
- A finite lattice of dataflow facts
- Distributive transfer functions
- No local variables, and no parameter passing

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Sharir and Pnueli Example (Available Expressions)



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Sharir and Pnueli Example

- Expression $a*b$ is NOT available at 4 if we consider all paths
 - E.g., along 1, 2,5, 6, 7,5, 6, 9,3, 4 $a*b$ gets “killed” due to $a = a - 1$, and it is not recomputed
- Expression $a*b$ is available at 4 if we consider only realizable paths
 - Path 1, 2,5, 6, 7,5, 6, 9,3, 4 is unrealizable because return edge 9,3 does not match the call edge 7,5
 - 1, 2, 5, 6, 7,5 ... 9,8,9 ...
 - We know “kill” 6,7 is succeeded by 7,5, which must be balanced with 9,8, which is succeeded by “gen”

Functional Approach to Interprocedural Dataflow Analysis

- Operates on unchanged property space
- Computes **summary transfer functions** Φ_p that summarize effect of procedure p
- Reduces problem to intraprocedural case:
 - $in(return\ p) = \Phi_p(in(call\ p))$
 - thus, avoids propagation from callee along the **exit $p \rightarrow return\ p$** edge!
- $S_{FA}(j)$ is the solution at j computed by functional approach

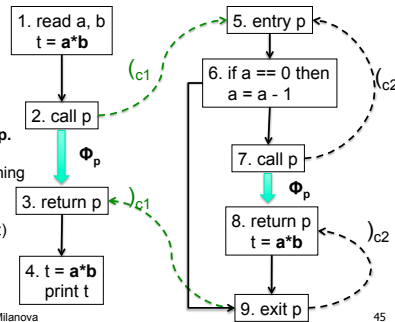
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Functional Approach

Phase 1:

Compute a **summary transfer function** Φ_p that captures effect of p . Assume our Φ_p is the **identity function**: nothing gets generated and nothing gets killed (simplifying things a bit)



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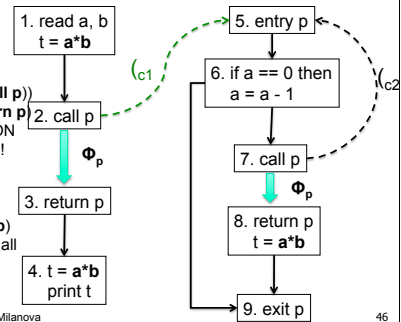
Functional Approach

Phase 2:

Dataflow analysis:

- At **return p**
 $in(return\ p) = \Phi_p(in(call\ p))$
 $out(return\ p) = in(return\ p)$
 AVOIDS PROPAGATION along exit-return edges!

- At **entry p**
 $in(entry\ p) = V\ in(call\ p)$
 (propagates facts from all callers to callee)



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Computing Summary Transfer Functions

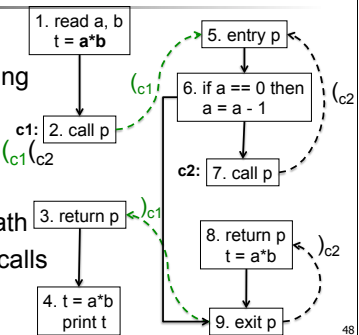
- For certain lattices and function spaces, we can compute summary transfer functions
 - The IFDS framework we discuss today
- In general, not clear how to compute Φ 's efficiently
- Ad-hoc approaches/approximation when computing Φ 's for specific monotone function spaces (points-to analysis, taint analysis)

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Call String Approach to Interprocedural Dataflow Analysis

- A **call string** records outstanding calls in path
 - E.g., call string $(c_1(c_2))$ denotes that “we got there” on a path with outstanding calls at c_1 and at c_2



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Call String Approach

- Tags solutions per program point with corresponding call string
- Multiple tagged solutions per program point j in p :
 - Sharir and Pnueli Example:
 - We have $\langle \{a*b\}, (c_1) \rangle$, $\langle \{\}, (c_1, c_2) \rangle$ at 6
 - Meaning: $a*b$ is available at 6 on paths with outstanding call string c_1 , but it is not available on paths with outstanding call string c_1, c_2

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Call String Approach

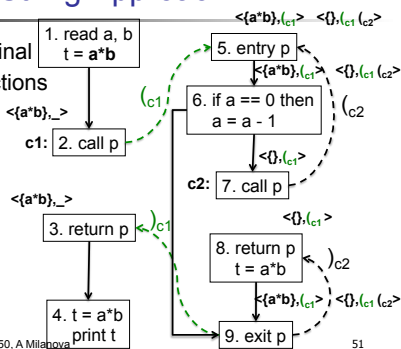
- Apply original transfer functions point-wise
- Apply on original dataflow lattice elements
 - $\{a*b\}$, $\{a*b, a+b\}$, $\{\}$, etc.

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Call String Approach

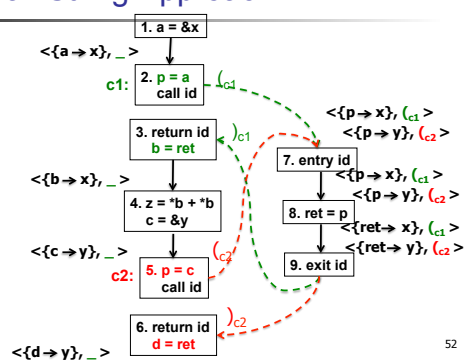
- Apply original transfer functions point-wise



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Call String Approach

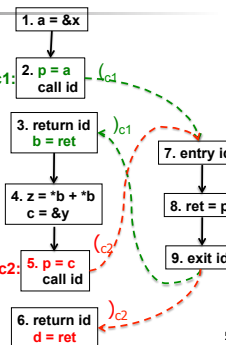


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Call String Approach

- At exit nodes, propagate only matching call strings!

$\langle \{ret \rightarrow x\}, (c_1) \rangle$,
 $\langle \{ret \rightarrow y\}, (c_2) \rangle$ at 9
 Propagate $\{ret \rightarrow y\}$ to 6,
 thus, $\{d \rightarrow y\}$, because (c_2)
 matches call string (c_2)

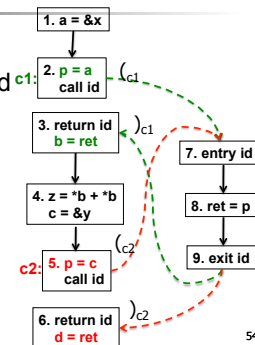


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Call String Approach

- What is $S_{CS}(8)$?
 Union of $\langle p \rightarrow x, (c_1) \rangle$ and $\langle p \rightarrow y, (c_2) \rangle$ so $S_{CS}(8)$ is graph $\{p \rightarrow x, p \rightarrow y\}$
- What is $S_{CS}(4)$?
- What is $S_{CS}(6)$?
 (out(6) more precisely)



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Sharir and Pnueli, Key Result

- $S_{FA}(j)$ is the solution at j computed by the functional approach
- $S_{CS}(j)$ is the solution at j computed by the call string approach
- For (certain) distributive functions and finite lattices
$$S_{FA}(j) = S_{CS}(j) = MORP(j)$$
- Caveats?

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Sharir and Pnueli, Key Result

- Caveats
 - Summary functions difficult to compute
 - With recursion, infinite call strings, S_{CS} is infinite
 - Even for distributive functions and finite lattices, S_{FA} and S_{CS} cannot be computed (efficiently)

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