### Differential Symbolic Execution

Suzette Person, Matthew B. Dwyer, Sebastian Elbaum University of Nebraska – Lincoln

Corina Păsăreanu NASA Ames Research Center

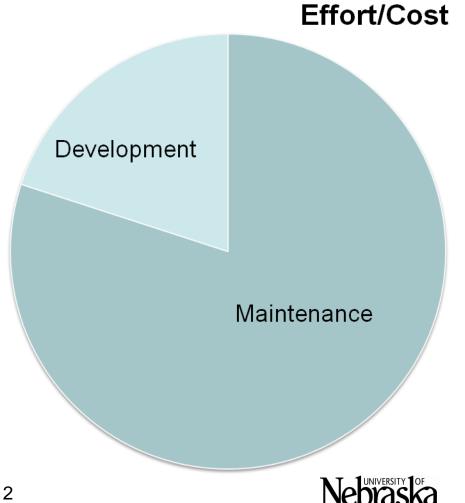
Funded in part by the National Science Foundation and NASA EPSCoR





#### Motivation

- Locate and fix faults
- Refactor code
- Extend functionality
- Merge versions





### Motivation

```
Java Structure Compare
🖅 🚺 Compilation Unit
   === @ readAttribute(Tokenizer)
                                                                                                 Java Source Compare
                                                               SIR-SienaV2/src/siena/SENP.java
SIR-SienaV1/src/siena/SENP.java
700 }
                                                               700 }
701
                                                               701
702 private static AttributeValue readAttribute(Tokenize:
                                                               702 private static AttributeValue readAttribute(Token
703 throws SENPInvalidFormat {
                                                               703 throws SENPInvalidFormat {
704 switch(t.nextToken()) {
                                                               704 switch(t.nextToken()) {
705 case Tokenizer.T STR: return new AttributeValue(t.sv
                                                               705 case Tokenizer.T ID: return new AttributeValue(t.
706 case Tokenizer.T INT: return new AttributeValue(t.iv
                                                               706 case Tokenizer.T STR: return new AttributeValue(t
    case Tokenizer.T BOOL: return new AttributeValue(t.b
                                                               707 case Tokenizer.T INT: return new AttributeValue(t
708 case Tokenizer.T DOUBLE: return new AttributeValue(t
                                                               708 case Tokenizer.T BOOL: return new AttributeValue(
709 default:
                                                               709 case Tokenizer.T DOUBLE: return new AttributeValue
710
        throw(new SENPInvalidFormat("<int>, <string>, <b()</pre>
                                                               710 default:
711 }
                                                               711
                                                                      throw(new SENPInvalidFormat("<int>, <string>,
712 }
                                                               712 }
713
                                                               713 }
714 private static AttributeConstraint readAttributeCons
                                                               714
715 throws SENPInvalidFormat {
                                                               715 private static AttributeConstraint readAttributeC
                                                        >
```





### Motivation

```
Java Source Compare
                                                            DSE/src/Logical2.java
DSE/src/Logical1.java
                                                                  int old;
      int old;
                                                             5
                                                                  int[] data;
 5
      int[] data;
                                                                  final int THRESHOLD = 100;
 7public int logicalValue(int t){
                                                            8public int logicalValue(int t){
      if (!(currentTime - t >= 100)){
                                                                  int elapsed = currentTime - t;
 9
          return old;
                                                            10
                                                                  int val = 0;
10
      }else{
                                                                  if (elapsed < THRESHOLD) {</pre>
11
          int val = 0;
                                                                      val = old;
                                                            12
12
          for (int i=0; i<data.length; i++){</pre>
                                                                  }else{
13
               val = val + data[i];
                                                                      for (int i=0; i<data.length; i++){</pre>
14
                                                                          val = val + data[i];
15
          old = val:
16
          return val;
                                                                      old = val;
17
                                                            18
18}
                                                            19
                                                                  return val:
19}
                                                           20}
20
```





# Differential Symbolic Execution (DSE)

 Detect and characterize the effects of program changes in terms of behavioral differences between program versions

Symbolic Execution

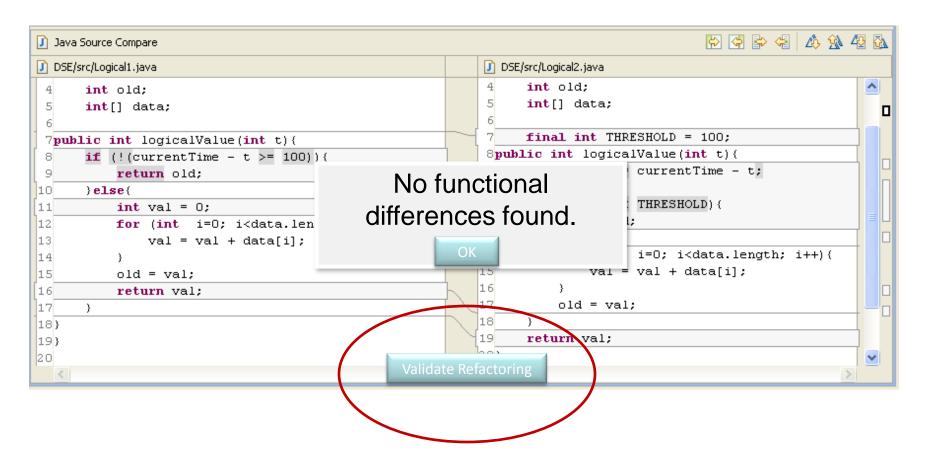
+

Over-approximating
Symbolic Summaries





# Differential Symbolic Execution (DSE)







### Overview of Presentation

- DSE methodology
- Summaries of program behavior
- Notions of equivalence and deltas
- Applications of DSE
- Related work
- Conclusions and future work

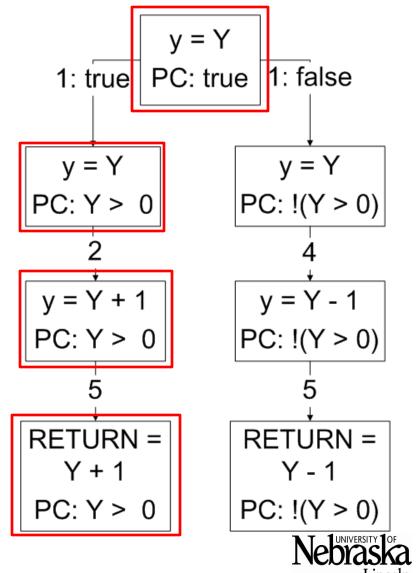




### Symbolic Execution

```
int m(int y){
1: if (y > 0)
2: y++;
3: else
4: y--;
5: return y;
}
```

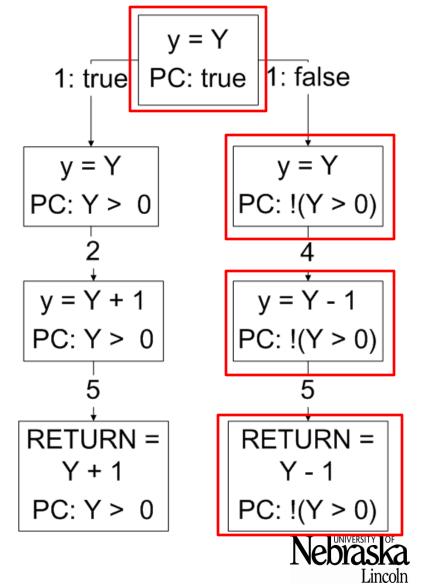
```
m_{sum}= {(Y > 0, RETURN==Y+1)}
```



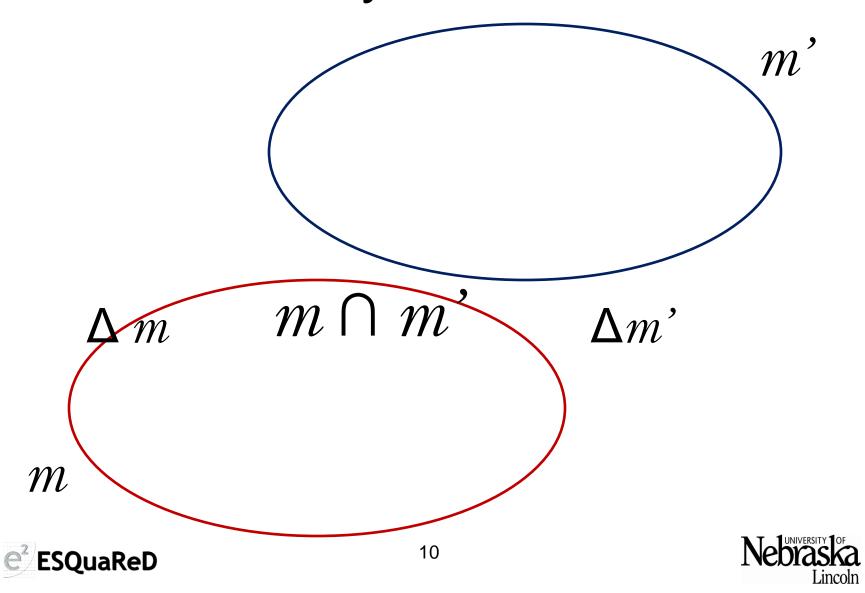
### Symbolic Execution

```
int m(int y){
1: if (y > 0)
2: y++;
3: else
4: y--;
5: return y;
}
```

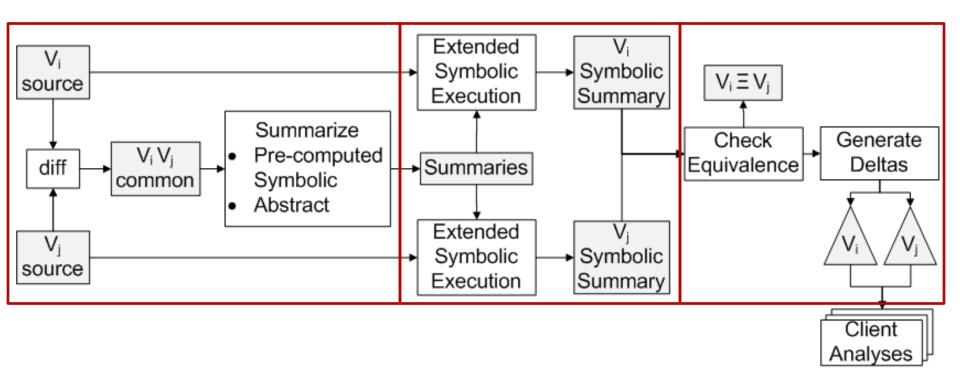
```
m_{sum}= {(Y > 0, RETURN==Y+1)}
(!(Y > 0), RETURN==Y-1)}
```



### Differential Symbolic Execution



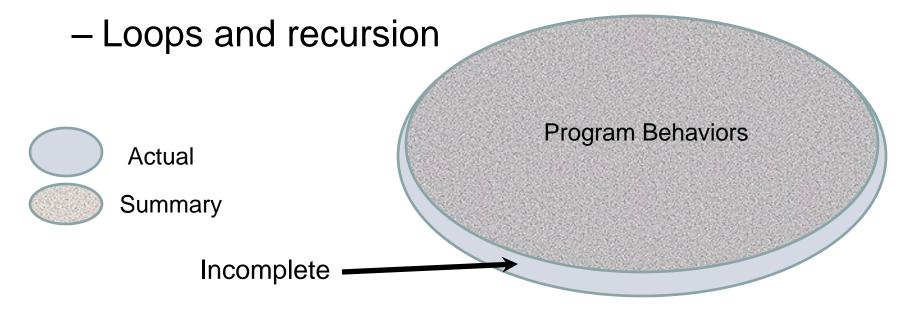
## Differential Symbolic Execution







- It is not always possible to compute complete summaries
  - Non-linear arithmetic







**Program Summary** 

Is all of the input space accounted for by the summary?

**Actual Program Behaviors** 





 $m_{sum} = \{(i_1, e_1), (i_2, e_2), (i_3, e_3)\}$ 

**Program Summary** 

Is the disjunction of inputs valid?

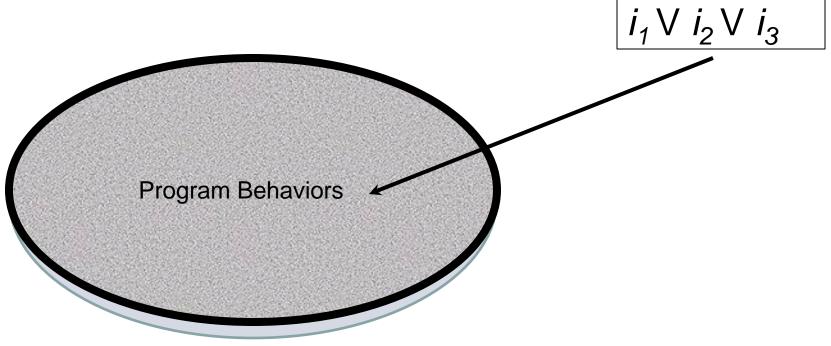
$$i_1 \lor i_2 \lor i_3$$

**Actual Program Behaviors** 





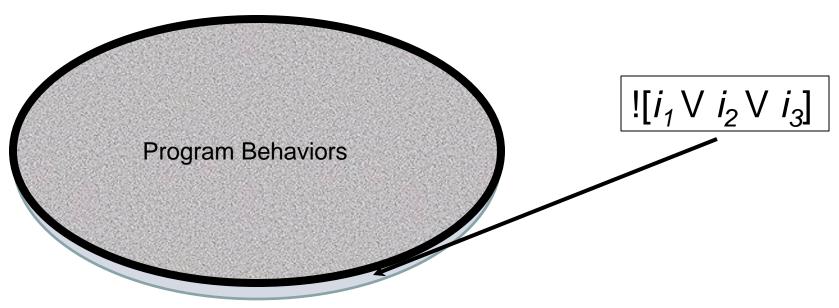
Explicitly define the input space covered by the summary







Focus subsequent analysis tool on behaviors not covered







## Abstract Summaries on Common Blocks

```
void test(){ //v1
                                                                  void test(){ //v2
                                                                   S<sub>a</sub>;
 S_1;
 S_2;
                                                                   S_h;
 for (int i=0; i<len; i++;){
                                                                  for (int i=0; i<len; i++;){
                                  Abstract Summary
   val = val + x[i];
                                                                      val = val + x[i];
                                  Read set:{x,val}
                                  Write set:{val,old}
                                                                   old = val;
 old = val;
                                                                   S<sub>m</sub>;
 S<sub>n</sub>;
```

Boolean  $IP_B(int[] X, int val)$ int old<sub>B</sub>(int[] X, int val) int val<sub>B</sub>(int[] X, int val)





## Abstract Summaries on Common Blocks

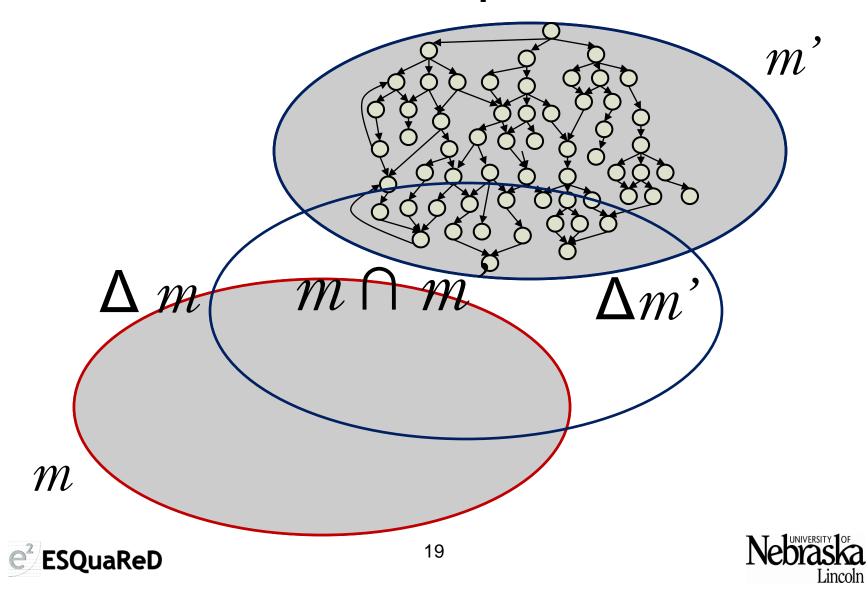
```
void test(){ //v1
 S<sub>1</sub>;
 S_2;
 for (int i=0; i<len; i++;){
    val = val + x[i];
  old = val;
 s<sub>n</sub>;
```

```
Standard
       Symbolic Execution
Instantiate abstract summary
                      IP_B(x,val)
                       old == old_{B}(x,val)
                       val == val_B(x, val)
            Standard
       Symbolic Execution
```

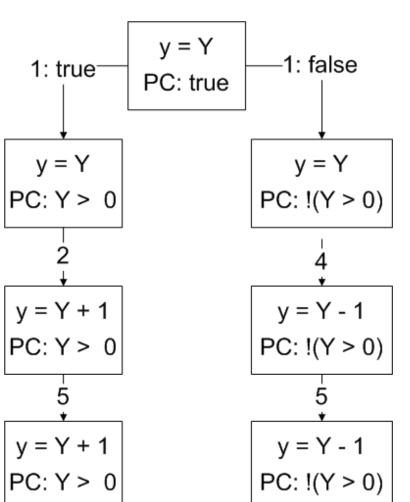




## Functional Equivalence



## Functional Equivalence



$$m_{sum}$$
=
{(Y > 0, RETURN==Y+1),
(!(Y > 0), RETURN==Y-1)}
$$\downarrow$$
 $m_{sum}$ =
(Y > 0 \( \Lambda \) RETURN==Y+1)
\( \V







## Functional Equivalence

int m(int y){//v1	int m(int y){//v2
1: if $(y > 0)$	1: if (y <= 0)
2: y++;	2: y;
3: else	3: else
4: y;	4: y++;
5: return y;	5: return y;
}	}

```
((Y > 0 \land RETURN==Y+1) \lor (!(Y > 0) \land RETURN==Y-1))
```

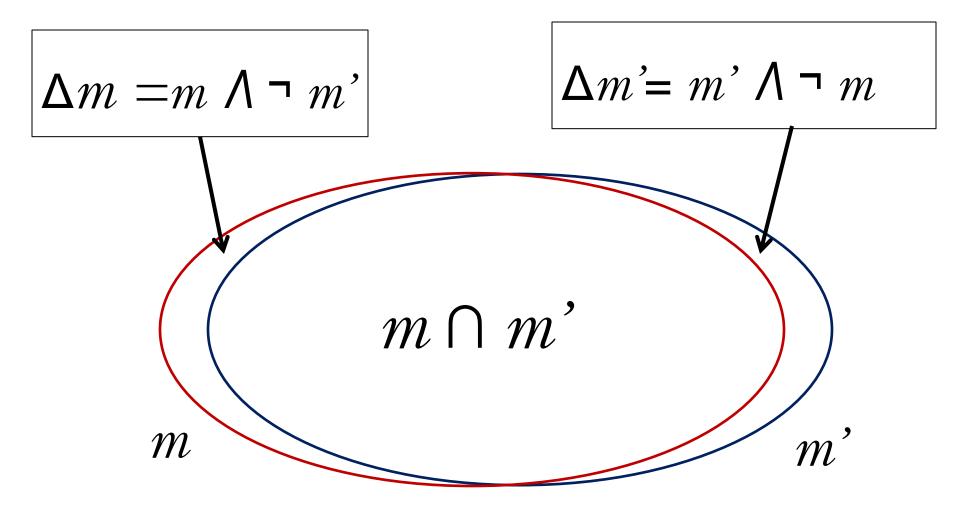
(Y <= 0 Λ RETURN==Y-1) V (Y <= 0) Λ RETURN==Y+1))

Functionally Equivalent?





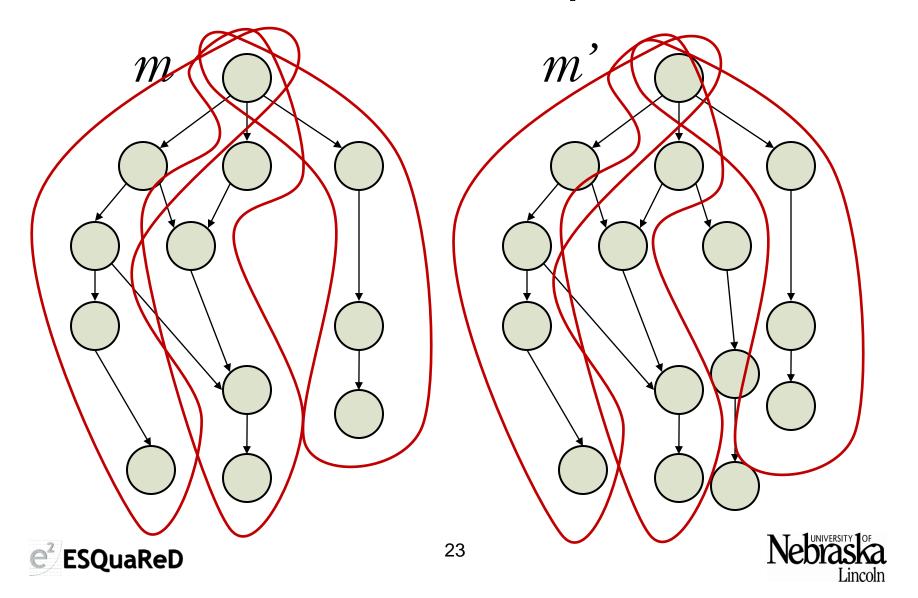
### **Functional Deltas**



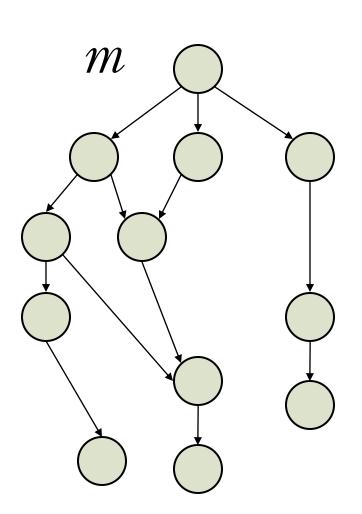


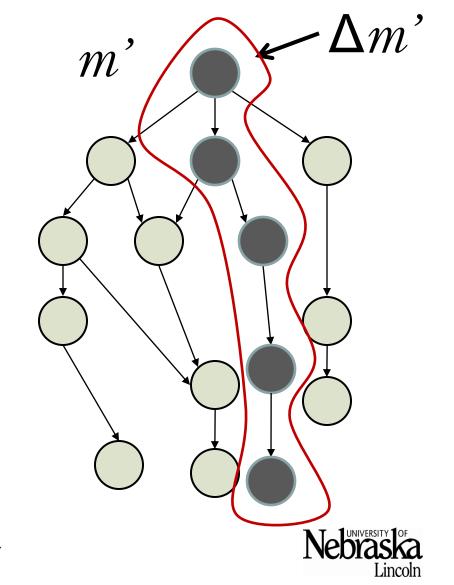


### Partition-effects Equivalence



### Partition-effects Delta







### Application of DSE

- Prototype based on Symbolic PathFinder (JPF) & CVC3 theorem prover
- Applied to artifacts from SIR
  - JMeter
  - Siena
- Client applications
  - Refactoring assurance
  - Test suite evolution
  - Change characterization





## Change Characterization

```
//Siena version 3
public static boolean match(byte[] x, byte[] y){
  if (x.len != y.len) return false;
  for(int i=0; i<x.len; ++i)
    if (x[i] != y[i]) return false;
  return true;
}
```

```
//Siena version 4
public static boolean match(byte[] x, byte[] y){
  if (x == null && y == null) return true;
  if (x == null || y ==null || x.len != y.len) return false;
  for(int i=0; i<x.len; ++i)
    if (x[i] != y[i]) return false;
  return true;
}
```

## Change Characterization

match() Version 3		
Input Partition	Effect	
X==null	RETURN == EXCEPTION	
Y==null	RETURN == EXCEPTION	
!(X==null) ∧ !(Y==null) ∧ (X.I !=Y.I)	RETURN == FALSE	
$!(X==null) \land !(Y==null) \land (X.I !=Y.I) \land IP_{B1}(T, X, Y)$	$RETURN == RET_{B1}(T, X, Y)$	

match() Version 4	

X==null Λ Y==null	RETURN == TRUE
$X==null \land !(Y==null)$	RETURN == FALSE
!(X==null) ∧ Y==null	RETURN == FALSE
$!(X==null) \land !(Y==null) \land (X.l !=Y.l)$	RETURN == FALSE
!(X==null) $\land$ !(Y==null) $\land$ (X.I !=Y.I) $\land$ IP <sub>B1</sub> (T, X, Y)	$RETURN == RET_{B1}(T, X, Y)$





### Change Characterization

On input	match() Version 3	match() Version 4
$x == null \land y == null$	throws NRE	RETURN == TRUE
$x == null \land y != null$	throws NRE	RETURN == FALSE
$x = null \land y == null$	throws NRE	RETURN == FALSE





#### Related Work

- Jackson et al. (ICSM '94)
- Neamtiu et al. (MSR '05)
- Apiwattanapong et al. (ASE '07)
- Santelices et al., Apiwattanapong et al. (ASE '08, TAIC PART '06)
- Siegel et al. (ISSTA '06, PVM/MPI '08)
- Notkin (PASTE '02)





### Conclusion

- Differential symbolic execution precisely detects and characterizes behavioral differences between two program versions
  - Functional equivalence and deltas
  - Partition-effects equivalence and deltas
- DSE leverages program commonalities to address summary completeness





### **Future Work**

- Further explore DSE algorithms and extend theoretical foundations
- Automate support for client applications
- Study the cost and effectiveness of DSE in automating software maintenance tasks





### Differential Symbolic Execution

Suzette Person, Matthew B. Dwyer, Sebastian Elbaum University of Nebraska – Lincoln

Corina Păsăreanu NASA Ames Research Center

Funded in part by the National Science Foundation and NASA EPSCoR



