

# Debugging and Slicing

Mohammad Mousavi

Halmstad University, Sweden

<http://bit.ly/TAV16>

Testing and Verification,  
March 4, 2016

# Outline

Sequential Slicing

Structured Slicing

Debugging

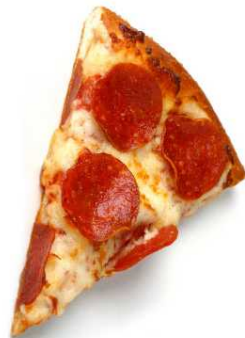
Simplifying the Test-Case

# Slices

An **executable** subset of the program

- ▶ capturing possible (**indirect**) **dependencies**
- ▶ among all definitions and uses
- ▶ influencing the value of a **set of variables**.

Also called: cone of influence reduction



# Annotated Flow Graphs

## Defining nodes

$DEF(n, v)$  holds (for a var.  $v$  and a node  $n$ ), when  $n$  defines  $v$ .

Examples:

- ▶  $input(v)$ , or
- ▶  $v := exp$

$$DEF(n) = \{v \mid DEF(n, v)\}$$

# Annotated Flow Graphs

## Using nodes

$USE(n, v)$  holds (for a var.  $v$  and a node  $n$ ), when  $n$  uses the values of  $v$ . Examples:

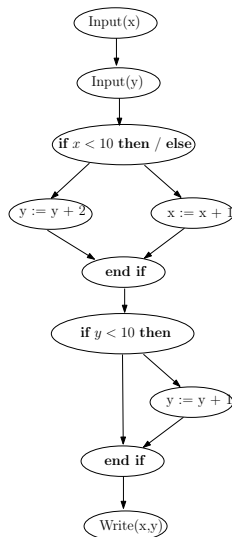
- ▶  $output(v)$ ,
- ▶  $x := exp(v)$ ,
- ▶ *if*  $cond(v)$  *then*, or
- ▶ *while*  $cond(v)$  *do*, ...

$$USE(n) = \{v \mid USE(n, v)\}$$

Also  $REF(n, v)$  in the literature

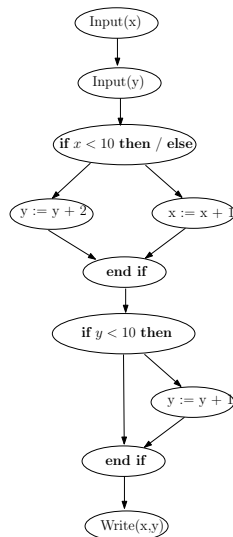
## Definitions and Uses: An Example

```
1: Input(x)
2: Input(y)
3: if  $x < 10$  then
4:    $y := y + 2$ 
5: else
6:    $x := x + 1$ 
7: end if
8: if  $y > 20$  then
9:    $y := y + 1$ ;
10: end if
11: Write(x,y)
12: end
```



## Definitions and Uses: An Example

- 1: Input(x) {DEF(1) = {x}}
- 2: Input(y) {DEF(2) = {y}}
- 3: **if** x < 10 **then**
- 4:   y := y + 2 {DEF(4) = USE(4) = {y}}
- 5: **else**
- 6:   x := x + 1
- 7: **end if**
- 8: **if** y > 20 **then**
- 9:   y := y + 1;
- 10: **end if**
- 11: Write(x,y) {USE(11) = {x,y}}
- 12: **end**



## Slicing: An Example

```
1: Input(x)
2: Input(y)
3: total := 0
4: sum := 0
5: if  $x \leq 1$  then
6:   sum := y
7: else
8:   Input(z)
9:   total :=  $x * y$ 
10: end if
11: Write(total, sum)
Slice on {total} at 11?
```



## Slicing: An Example

```
1: Input(x)
2: Input(y)
3: total := 0
4: sum := 0
5: if  $x \leq 1$  then
6:   sum := y
7: else
8:   Input(z)
9:   total :=  $x * y$ 
10: endif
11: Write(total, sum)
Slice on {total} at 11?
```

## Slicing: An Example

Slice on  $\{total\}$  at 11:

```
1: Input(x)
2: Input(y)
3: total := 0
4: if  $x \leq 1$  then
5:
6: else
7:   total = x * y
8: end if
```

## Slicing: An Example

- 1: Input(b)
- 2:  $c := 1$
- 3:  $d := 3$
- 4:  $a := d$
- 5:  $d := b + d$
- 6:  $b := b + 1$
- 7:  $a := b + c$
- 8: Write(a)

Slice on  $\{d, c\}$  at 6?

## Slicing: An Example

Slice on  $\{d, c\}$  at 6:

- 1: Input(b)
- 2:  $c := 1$
- 3:  $d := 3$
- 4:  $d := b + d$

$(6, \{d, c\})$  (in general  $(n, V)$ ): **the slicing criterion**

# Outline of the algorithm

## Slice criterion $(n, V)$

- ▶ Statements in the slice: those **define** the **relevant** variables.
- ▶ At  $n$ ,  $v \in V$ : relevant.
- ▶ A relevant  $v \in DEF(m)$ :  $v$  is **no more relevant** above  $m$ ,
- ▶ **but** then all variables in  $USE(m)$  become relevant above  $m$ .

## Relevant Variables

Given a slicing criterion  $(n, V)$ ,  $Relevant_0(m) =$

$$\begin{cases} V & \text{if } m = n + 1 \\ \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m) \vee \\ (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m)))\} & \text{otherwise} \end{cases}$$

## Relevant Variables

Given a slicing criterion  $(n, V)$ ,  $Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \vee \\ 2b) \quad (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m))\} & \text{otherwise} \end{cases}$$

- 1) base case: all variables in  $V$  are initially relevant
- 2a)  $v$  remains relevant: has been relevant below and not defined at  $m$
- 2b)  $v$  becomes relevant: defines relevant variables

## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) \ V & \text{if } m = n + 1 \\ 2a) \ \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \} & \text{otherwise} \\ 2b) \ \{v \mid (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m))\} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

2 c := 1

3 d := 3

4 a := d

5 d := b + d

6 b := b + 1

$\{d, c\}$



## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \} & \text{otherwise} \\ 2b) (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m)) \} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

2  $c := 1$

3  $d := 3$

4  $a := d$

5  $d := b + d$

6  $b := b + 1$      $\{d, c\}$

$\{d, c\}$

## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \vee \\ 2b) (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m))\} & \text{otherwise} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

2  $c := 1$

3  $d := 3$

4  $a := d$

5  $d := b + d$      $\{c, b, d\}$

6  $b := b + 1$      $\{d, c\}$

$\{d, c\}$

## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \} & \text{otherwise} \\ 2b) (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m)) \} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

2  $c := 1$

3  $d := 3$

4  $a := d$                        $\{c, b, d\}$

5  $d := b + d$                    $\{c, b, d\}$

6  $b := b + 1$                    $\{d, c\}$

$\{d, c\}$

## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m) \vee \\ 2b) (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m))\} & \text{otherwise} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

2  $c := 1$

3  $d := 3$              $\{c, b\}$

4  $a := d$              $\{c, b, d\}$

5  $d := b + d$          $\{c, b, d\}$

6  $b := b + 1$          $\{d, c\}$

$\{d, c\}$

## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \} & \text{otherwise} \\ 2b) (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m)) \} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

2  $c := 1$                        $\{b\}$

3  $d := 3$                        $\{c, b\}$

4  $a := d$                        $\{c, b, d\}$

5  $d := b + d$                        $\{c, b, d\}$

6  $b := b + 1$                        $\{d, c\}$

$\{d, c\}$

## Slicing: An Example

Slicing criterion:  $(6, \{d, c\})$  ?

$Relevant_0(m) =$

$$\begin{cases} 1) V & \text{if } m = n + 1 \\ 2a) \{v \mid \exists_{m \rightarrow m'} (v \in relevant(m') \setminus DEF(m)) \} & \text{otherwise} \\ 2b) (DEF(m) \cap relevant(m') \neq \emptyset \wedge v \in USE(m)) \} \end{cases}$$

**m**                      **Relevant<sub>0</sub>(m)**

1 Input(b)

$\emptyset$

2  $c := 1$

$\{b\}$

3  $d := 3$

$\{c, b\}$

4  $a := d$

$\{c, b, d\}$

5  $d := b + d$

$\{c, b, d\}$

6  $b := b + 1$

$\{d, c\}$

$\{d, c\}$

# Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$		
2 $c := 1$	$\{b\}$		
3 $d := 3$	$\{c, b\}$		
4 $a := d$	$\{c, b, d\}$		
5 $d := b + d$	$\{c, b, d\}$		
6 $b := b + 1$	$\{d, c\}$		
	$\{d, c\}$		



## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$		
2 $c := 1$	$\{b\}$		
3 $d := 3$	$\{c, b\}$		
4 $a := d$	$\{c, b, d\}$		
5 $d := b + d$	$\{c, b, d\}$		
6 $b := b + 1$	$\{d, c\}$ $\{d, c\}$	$\{b\}$	×

## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$		
2 $c := 1$	$\{b\}$		
3 $d := 3$	$\{c, b\}$		
4 $a := d$	$\{c, b, d\}$		
5 $d := b + d$	$\{c, b, d\}$	$\{d\}$	✓
6 $b := b + 1$	$\{d, c\}$ $\{d, c\}$	$\{b\}$	×

## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$		
2 $c := 1$	$\{b\}$		
3 $d := 3$	$\{c, b\}$		
4 $a := d$	$\{c, b, d\}$	$\{a\}$	×
5 $d := b + d$	$\{c, b, d\}$	$\{d\}$	✓
6 $b := b + 1$	$\{d, c\}$ $\{d, c\}$	$\{b\}$	×

## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$		
2 $c := 1$	$\{b\}$		
3 $d := 3$	$\{c, b\}$	$\{d\}$	✓
4 $a := d$	$\{c, b, d\}$	$\{a\}$	×
5 $d := b + d$	$\{c, b, d\}$	$\{d\}$	✓
6 $b := b + 1$	$\{d, c\}$ $\{d, c\}$	$\{b\}$	×

## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$		
2 $c := 1$	$\{b\}$	$\{c\}$	✓
3 $d := 3$	$\{c, b\}$	$\{d\}$	✓
4 $a := d$	$\{c, b, d\}$	$\{a\}$	×
5 $d := b + d$	$\{c, b, d\}$	$\{d\}$	✓
6 $b := b + 1$	$\{d, c\}$ $\{d, c\}$	$\{b\}$	×

## Slicing Sequential Programs

$m \in \text{Slice}_0(n, V)$  when

1.  $n = m$  and  $\text{DEF}(m) \cap V \neq \emptyset$ , or
2.  $m \rightarrow \dots \rightarrow n$  and  
there exists an  $m'$  such that  $m \rightarrow m'$  and  
 $\text{DEF}(m) \cap \text{Relevant}_0(m') \neq \emptyset$

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(6, {d, c})</b>
1 Input(b)	$\emptyset$	$\{b\}$	✓
2 $c := 1$	$\{b\}$	$\{c\}$	✓
3 $d := 3$	$\{c, b\}$	$\{d\}$	✓
4 $a := d$	$\{c, b, d\}$	$\{a\}$	×
5 $d := b + d$	$\{c, b, d\}$	$\{d\}$	✓
6 $b := b + 1$	$\{d, c\}$ $\{d, c\}$	$\{b\}$	×

# Outline

Sequential Slicing

**Structured Slicing**

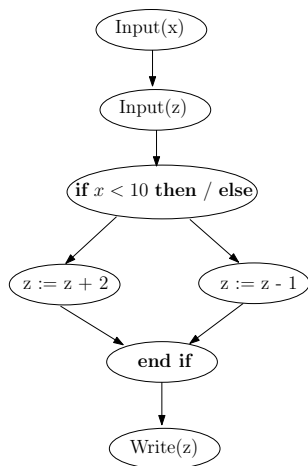
Debugging

Simplifying the Test-Case

## Slicing Programs with Conditions

```
1: Input(x)
2: Input(z)
3: if  $x < 10$  then
4:    $z := z + 2$ ;
5: else
6:    $z := z - 1$ ;
7: end if
8: Write(z)
```

Slice wrt. the criterion  $(3, \{x\})$ ?





## Slicing Programs with Conditions

Slice wrt. the criterion  $(3, \{x\})$ ?

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(3, {x})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
		{x}	

## Slicing Programs with Conditions

Slice wrt. the criterion  $(3, \{x\})$ ?

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(3, {x})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	$\{x\}$ $\{x\}$	$\emptyset$	×

## Slicing Programs with Conditions

Slice wrt. the criterion  $(3, \{x\})$ ?

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(3, {x})</b>
1 Input(x)			
2 Input(z)	{x}	{z}	×
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	{x}	∅	×
	{x}		

## Slicing Programs with Conditions

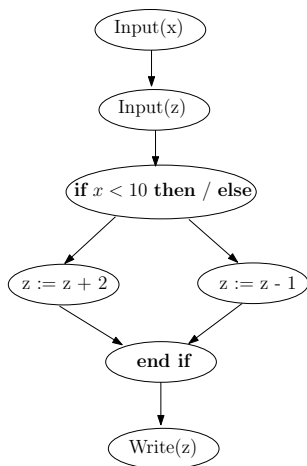
Slice wrt. the criterion  $(3, \{x\})$ ?

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(3, {x})</b>
1 Input(x)	$\emptyset$	$\{x\}$	✓
2 Input(z)	$\{x\}$	$\{z\}$	×
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	$\{x\}$ $\{x\}$	$\emptyset$	×

## Slicing Programs with Conditions

```
1: Input(x)
2: Input(z)
3: if  $x < 10$  then
4:    $z := z + 2$ ;
5: else
6:    $z := z - 1$ ;
7: end if
8: Write(z)
```

Slice wrt. the criterion  $(8, \{z\})$ ?



## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$			
7 <b>end if</b>			
8 Write(z)			
		{z}	

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$			
7 <b>end if</b>			
8 Write(z)	{z}	∅	×
	{z}		

# Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$			
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		



## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$	{z}	{z}	✓
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	{z}	∅	×
4 $z := z + 2$	{z}	{z}	✓
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)	$\emptyset$	$\{z\}$	✓
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	$\{z\}$	$\emptyset$	×
4 $z := z + 2$	$\{z\}$	$\{z\}$	✓
6 $z := z - 1$	$\{z\}$	$\{z\}$	✓
7 <b>end if</b>	$\{z\}$	$\emptyset$	×
8 Write(z)	$\{z\}$	$\emptyset$	×
	$\{z\}$		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>0</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>0</sub>(8, {z})</b>
1 Input(x)	∅	{x}	×
2 Input(z)	∅	{z}	✓
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	{z}	∅	×
4 $z := z + 2$	{z}	{z}	✓
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Structured Programs: Informal Idea

1. Start with sequential slicing algorithm:  $Slice_0(n, v)$
2. Find all **conditionals**  $Cond_{k+1}(n, V)$  influencing  $m \in Slice_k(n, v)$
3. Add the following node to  $Slice_k(n, V)$ , the result:  $Slice_{k+1}(n, V)$ 
  - 3.1 the **conditional** in  $c \in Cond_k n, V$  and
  - 3.2 those statement **influencing the conditions** of  $c$
4. repeat 2 until a **fixed-point**

## (Inverse) Denominators

$m \in IDen(n)$  ( $m$  inversely denominates  $n$ )  
when  $m$  appears in **all** paths  $n \rightarrow \dots \rightarrow n_t$ .

$m = NIDen(n)$  (the nearest inverse denominator of  $n$ ) when  
 $m \in IDen(n)$  and  
for all  $m' \in IDen(n)$  either  $m = m'$  or there is a simple path  
 $m \rightarrow \dots \rightarrow m'$ .

$m \in Infl(n)$  ( $m$  is influenced by  $n$ ) when  
 $m$  appears in a path from  $n$  to  $NIDen(n)$   
( $m \neq n$ ,  $m \neq NIDen(n)$ ,  $NIDen(n)$  may not appear in the path).

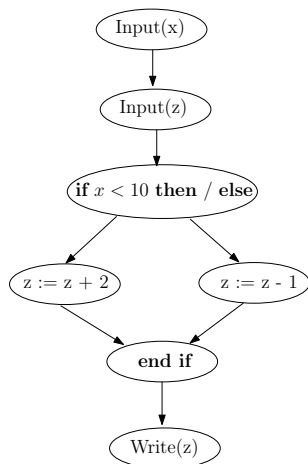
## Slicing Programs with Conditions

```
1: Input(x)
2: Input(z)
3: if  $x < 10$  then
4:    $z = z + 2$ ;
5: else
6:    $z = z - 1$ ;
7: end if
8: Write(z)
```

*NIDen*(1)?    *Infl*(1)?

*NIDen*(2)?    *Infl*(2)?

*NIDen*(3)?    *Infl*(3)?





## Slicing Programs with Conditions

```

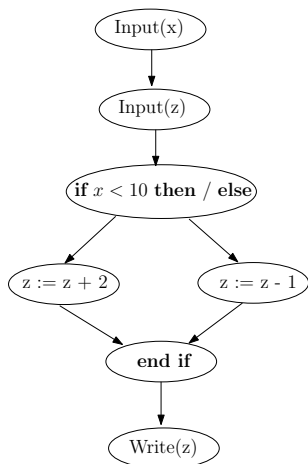
1: Input(x)
2: Input(z)
3: if  $x < 10$  then
4:    $z = z + 2$ ;
5: else
6:    $z = z - 1$ ;
7: end if
8: Write(z)

```

$NIDen(1)?$  2.  $Infl(1)?$   $\emptyset$ .

$NIDen(2)?$   $Infl(2)?$

$NIDen(3)?$   $Infl(3)?$



## Slicing Programs with Conditions

```

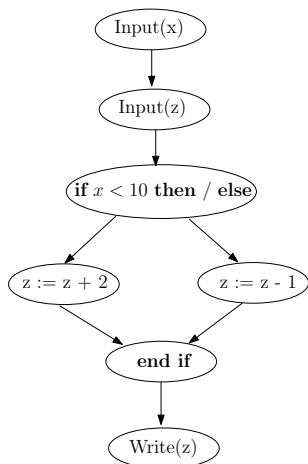
1: Input(x)
2: Input(z)
3: if  $x < 10$  then
4:    $z = z + 2$ ;
5: else
6:    $z = z - 1$ ;
7: end if
8: Write(z)
  
```

$NIDen(1)?$  2.  $Infl(1)?$   $\emptyset$ .

$NIDen(2)?$  3.  $Infl(2)?$   $\emptyset$ .

Observation, for **sequential** nodes  $Infl(n) = \emptyset$ .

$NIDen(3)?$   $Infl(3)?$



## Slicing Programs with Conditions

```

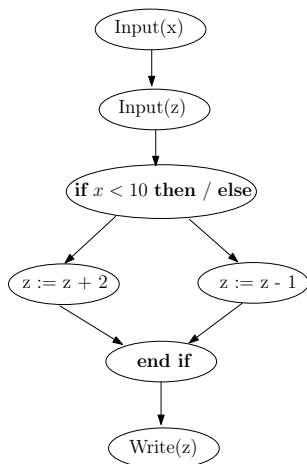
1: Input(x)
2: Input(z)
3: if  $x < 10$  then
4:    $z = z + 2$ ;
5: else
6:    $z = z - 1$ ;
7: end if
8: Write(z)
  
```

$NIDen(1)?$  2.  $Infl(1)?$   $\emptyset$ .

$NIDen(2)?$  3.  $Infl(2)?$   $\emptyset$ .

Observation, for **sequential** nodes  $Infl(n) = \emptyset$ .

$NIDen(3)?$  7.  $Infl(3)?$   $\{4, 6\}$ .



## Slicing Structured Programs

Given a slicing criterion  $(n, V)$ :

$m \in \mathit{Cond}_{k+1}(n, V)$  (conditions influencing  $\mathit{Slice}_k(n, V)$ ) when there exists  $m' \in \mathit{Slice}_k(n, V)$  and  $m' \in \mathit{Infl}(m)$ .

## Slicing Structured Programs

Given a slicing criterion  $(n, V)$ :

$m \in \mathit{Cond}_{k+1}(n, V)$  (conditions influencing  $\mathit{Slice}_k(n, V)$ ) when there exists  $m' \in \mathit{Slice}_k(n, V)$  and  $m' \in \mathit{Infl}(m)$ .

$v \in \mathit{Relevant}_{k+1}(m)$  when

$v \in \mathit{Relevant}_k(m)$  or

there exists an  $m' \in \mathit{Cond}_{k+1}(n, V)$  and

$v \in \mathit{Relevant}_0(m)$  w.r.t. the slicing criterion  $(m', \mathit{USE}(m'))$ .

## Slicing Structured Programs

Given a slicing criterion  $(n, V)$ :

$m \in \mathit{Cond}_{k+1}(n, V)$  (conditions influencing  $\mathit{Slice}_k(n, V)$ ) when there exists  $m' \in \mathit{Slice}_k(n, V)$  and  $m' \in \mathit{Infl}(m)$ .

$v \in \mathit{Relevant}_{k+1}(m)$  when

$v \in \mathit{Relevant}_k(m)$  or

there exists an  $m' \in \mathit{Cond}_{k+1}(n, V)$  and

$v \in \mathit{Relevant}_0(m')$  w.r.t. the slicing criterion  $(m', \mathit{USE}(m'))$ .

$m \in \mathit{Slice}_{k+1}(n, V)$  when

$m \in \mathit{Cond}_{k+1}(n, V)$  or

there exists an  $m'$  such that  $m \rightarrow m'$  and

$\mathit{DEF}(m) \cap \mathit{Relevant}_{k+1}(m') \neq \emptyset$ .

## Slicing Programs with Conditions

Slice wrt.  $(8, \{z\})$

- 1: Input(x)
- 2: Input(z)
- 3: **if**  $x < 10$  **then**
- 4:    $z = z + 2$ ;
- 5: **else**
- 6:    $z = z - 1$ ;
- 7: **end if**
- 8: Write(z)

## Slicing Programs with Conditions

Slice wrt.  $(8, \{z\})$

- 1: Input(x)
- 2: Input(z)
- 3: **if**  $x < 10$  **then**
- 4:    $z = z + 2$ ;
- 5: **else**
- 6:    $z = z - 1$ ;
- 7: **end if**
- 8: Write(z)

$Slice_0(8, \{z\}) = \{2, 4, 6\}$ .



## Slicing Programs with Conditions

Slice wrt.  $(8, \{z\})$

- 1: Input(x)
- 2: Input(z)
- 3: **if**  $x < 10$  **then**
- 4:    $z = z + 2$ ;
- 5: **else**
- 6:    $z = z - 1$ ;
- 7: **end if**
- 8: Write(z)

$Slice_0(8, \{z\}) = \{2, 4, 6\}$ .

$m \in Cond_{k+1}(n, V)$  (conditions influencing  $Slice_k(n, V)$ ) when there exists  $m' \in Slice_k(n, V)$  and  $m' \in Infl(m)$ .

## Slicing Programs with Conditions

Slice wrt.  $(8, \{z\})$

- 1: Input(x)
- 2: Input(z)
- 3: **if**  $x < 10$  **then**
- 4:    $z = z + 2$ ;
- 5: **else**
- 6:    $z = z - 1$ ;
- 7: **end if**
- 8: Write(z)

$Slice_0(8, \{z\}) = \{2, 4, 6\}$ .

$Cond_1(8, \{z\}) = \{3\}$

$Slice_1(8, \{z\})?$

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$			
7 <b>end if</b>			
8 Write(z)			
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$			
7 <b>end if</b>			
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$			
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$			
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>			
4 $z := z + 2$	{z}	{z}	✓
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

# Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)			
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	$\{z, x\}$	$\emptyset$	×
4 $z := z + 2$	$\{z\}$	$\{z\}$	✓
6 $z := z - 1$	$\{z\}$	$\{z\}$	✓
7 <b>end if</b>	$\{z\}$	$\emptyset$	×
8 Write(z)	$\{z\}$	$\emptyset$	×
	$\{z\}$		



## Slicing Programs with Conditions

<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)			
2 Input(z)	{x}	{z}	✓
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	{z, x}	∅	×
4 $z := z + 2$	{z}	{z}	✓
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×
	{z}		

## Slicing Programs with Conditions

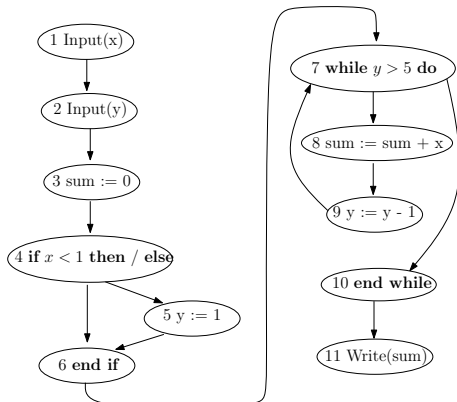
<b>m</b>	<b>Relevant<sub>1</sub>(m)</b>	<b>DEF(m)</b>	<b>∈ Slice<sub>1</sub>(8, {z})</b>
1 Input(x)	∅	{x}	✓
2 Input(z)	{x}	{z}	✓
3,5 <b>if</b> $x < 10$ <b>then</b> / <b>else</b>	{z, x}	∅	×
4 $z := z + 2$	{z}	{z}	✓
6 $z := z - 1$	{z}	{z}	✓
7 <b>end if</b>	{z}	∅	×
8 Write(z)	{z}	∅	×

## Another Example

Slice wrt.  $(11, \{sum\})$ ?

```

1: Input(x)
2: Input(y)
3: sum := 0
4: if  $x < 1$  then
5:    $y := 1$ 
6: end if
7: while  $y \geq 1$  do
8:    $sum := sum + x$ 
9:    $y := y - 1$ 
10: end while
11: Write(sum)
  
```



m	DEF(m)	Relevant <sub>0</sub> (m)	Slice <sub>0</sub>	Cond <sub>1</sub>	Rel <sub>1</sub>	Slice <sub>1</sub>
1	{x}	∅	√,	×	∅	√
2	{y}	{x}	×	×	{x}	√
3	{sum}	{x}	√	×	{x, y}	√
4	∅	{sum, x}	×	×	{sum, x, y}	×
5	{y}	{sum, x}	×	×	{sum, x}	√
6	∅	{sum, x}	×	×	{sum, x, y}	×
7	∅	{sum, x}	×	√	{sum, x, y}	√
8	{sum}	{sum, x}	√	×	{sum, x, y}	√
9	{y}	{sum, x}	×	×	{sum, x, y}	√
10	∅	{sum}	×	×	{sum}	×
11	∅	{sum}	×	×	{sum}	×
		{sum}			{sum}	

m	DEF(m)	Cond <sub>2</sub>	Rel <sub>2</sub>	Slice <sub>2</sub>	Slice <sup>(*)</sup>
1	{x}	×	∅	✓	✓
2	{y}	×	{x}	✓	✓
3	{sum}	×	{x, y}	✓	✓
4	∅	✓	{sum, x, y}	✓	✓
5	{y}	×	{sum, x}	✓	✓
6	∅	×	{sum, x, y}	×	✓
7	∅	✓	{sum, x, y}	✓	✓
8	{sum}	×	{sum, x, y}	✓	✓
9	{y}	×	{sum, x, y}	✓	✓
10	∅	×	{sum}	×	✓
11	∅	×	{sum}	×	×

(\*) Syntactic check after generating the slice:

**if then (/else) ∈ Slice** ⇒ (the corresponding) **end if** ∈ Slice

**while ... do** ∈ Slice ⇒ (the corresponding) **end while** ∈ Slice

...

# The Ideal Slicing Algorithm?

Slice wrt.  $(2, \{x\})$ ?

- 1: Input(x)
- 2:  $x := x$

## The Ideal Slicing Algorithm?

Slice wrt.  $(2, \{x\})$ ?

- 1: Input(x)
- 2:  $x := x$

Slice wrt.  $(5, \{x\})$ ?

- 1: **if** true **then**
- 2:    $x := 1$
- 3: **else**
- 4:    $x := 2$
- 5: **end if**

## The Ideal Slicing Algorithm?

Slice wrt.  $(2, \{x\})$ ?

- 1: Input(x)
- 2:  $x := x$

Slice wrt.  $(5, \{x\})$ ?

- 1: **if** true **then**
- 2:    $x := 1$
- 3: **else**
- 4:    $x := 2$
- 5: **end if**

No algorithm for the **smallest slice** exists!

Reason: **Undecidability** of halting/termination.



## Slicing: Applications

1. Test adequacy: for each output variable, all du-paths in its slice must be covered
2. Robustness testing: Add pseudo-variables that check dangerous situations, generate the slice and test
3. Regression testing: testing if a change influences a particular component (i.e., if the slice of the component interface contains the change)
4. Debugging:  
code review  
comparing a correct running program with a new faulty version

# Outline

Sequential Slicing

Structured Slicing

**Debugging**

Simplifying the Test-Case

## (Automated) Debugging: A Sorting Program

```
1: int main(int argc, char * argv[])
2: {
3:   int *a;
4:   int i;
5:   a = (int *) malloc( (argc - 1) * sizeof(int) );
6:   for (i = 0; i < argc - 1; i++)
7:     a[i] = atoi(argv[i + 1]);
8:   shell_sort(a, argc);
9:   printf(" Output: ");
10:  for (i = 0; i < argc - 1; i++)
11:    printf("%d ", a[i]);
12:  free(a);
13:  return 0;
14: }
```

```
1: void shell_sort(int a[], int size)
2: { int i, j; int h = 1;
3: do {
4:     h = h * 3 + 1;
5: } while (h <= size);
6: do {
7:     h /= 3;
8:     for (i = h; i < size; i++)
9:     {
10:        int v = a[i];
11:        for (j = i; j >= h && a[j - h] > v; j -= h)
12:            a[j] = a[j - h];
13:        if (i != j)    a[j] = v;
14:    }
15: } while (h != 1);
16: }
```

## (Automated) Debugging: A Sorting Program

Once upon a time, a tester found the following bug:

```
$ ./simple 5 4 3 2 1 666666  
Output: 0 1 2 3 4 5
```

How do we find **the fault**?

## Find and Focus

- ▶ Scientific method:
  1. assume,
  2. organize an experiment,
  3. if refuted, refine your assumption and repeat.possible formalization: invariants and assertions
- ▶ Observing: logging the value of infected variables  
e.g., `print` command in `gdb`
- ▶ Watching: keeping an eye on infected variables  
e.g., `break` and `watch` commands in `gdb`
- ▶ Slicing: find the slice responsible for infection  
see the lecture on slicing



## Getting Our Hands Dirty...

We use gdb (any other debugger will do)

- ▶ **Reproduce** the test:  
run 5 4 3 2 1 666666 Damn, the tester was right!  
(Not always that easy, try 55 4.)
- ▶ **Simplify** the test-case  
run 5 4 3 2
- ▶ **Find** the possible the **origins**,  
**focus** on a problem area,  
e.g., `a[0]` and `shell_sort` (See **slicing** next...)
- ▶ **Isolate** the causes  
what makes `a[0]` wrong?  
compare it with the sane situation, what is different?
- ▶ **Correct** the problem



# TRAFFIC

1. **T**rack the problem
2. **R**eproduce the failure
3. **A**utomate and simplify the test-case:  
minimal test-case ⇐
4. **F**ind possible origins: where it first went wrong
5. **F**ocus on the most likely origins: what part of state is infected
6. **I**solate the chain: what causes the state to be infected ⇐
7. **C**orrect the defect





# Automated Debugging is about Perfection

## Perfection

*Perfection is achieved not when you have nothing more to add, but when there is **nothing more left to take away**.*

Antoine de Saint-Exupéry

# Automated Debugging is about Perfection

## Perfection

*Perfection is achieved not when you have nothing more to add, but when there is **nothing more left to take away**.*

Antoine de Saint-Exupéry

## Automated Debugging

**Take out** all that has nothing to do with the **failure**...

## Debugging: An Example

- ▶ My slides for today (in  $\text{\LaTeX}$ ) did not compile
- ▶ some part of it did work before (older slides)

## Debugging: An Example

- ▶ My slides for today (in  $\text{\LaTeX}$ ) did not compile
- ▶ some part of it did work before (older slides)
- ▶ divide the new parts into two:
  1. remove first half part
  2. if the problem is there, repeat until one (new) slide is left
  3. if not, put back the second half and remove the first, repeat
- ▶ apply the same technique to the content of the remaining slide

## Debugging: An Example

- ▶ My slides for today (in  $\text{\LaTeX}$ ) did not compile
- ▶ some part of it did work before (older slides)
- ▶ divide the new parts into two:
  1. remove first half part
  2. if the problem is there, repeat until one (new) slide is left
  3. if not, put back the second half and remove the first, repeat
- ▶ apply the same technique to the content of the remaining slide

This is called **delta debugging**:  
our order of business for today.

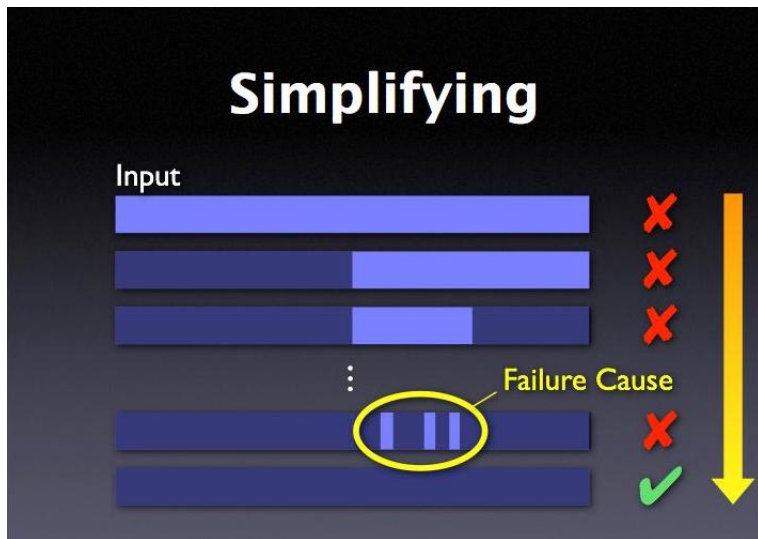
# Outline

Sequential Slicing

Structured Slicing

Debugging

Simplifying the Test-Case



(Ack. figures are due to Andreas Zeller.)

## Minimizing Delta Debugging: Basic Idea

Try to find the minimal environment causing the failure by:

- ▶ Divide the circumstances  $C$  in  $n$  parts  $C_i$ ,
- ▶ remove a part  $C_i$  such that  $C \setminus C_i$  causes failure, repeat the algorithm with  $C \setminus C_i$ ,
- ▶ if no such part exists, choose a bigger  $n < |C|$  and repeat.



## Minimizing Delta Debugging: Formalization

- ▶ Circumstances:  $C$  (input but could be: program, environment, etc.)
- ▶ Test:  $test : 2^C \rightarrow \{\times, \checkmark, ?\}$
- ▶ Starting state:  $C_x \subseteq C$ , such that  $test(C_x) = \times$
- ▶ Goal: find a **minimal subset**  $C'_x \subseteq C_x$  such that  $test(C'_x) = \times$

## Minimizing Delta Debugging: Algorithm

$ddmin(C_x, 2)$ , where

$ddmin(C'_x, n) =$

$$\begin{cases} C'_x, & \text{if } |C'_x| = 1, \\ ddmin(C'_x \setminus C_i, \max(n-1, 2)) & \text{else if } \exists_{i \leq n} \text{test}(C'_x \setminus C_i) = \times \\ ddmin(C'_x, \max(2n, |C'_x|)) & \text{else if } n < |C'_x| \\ C'_x & \text{otherwise} \end{cases}$$

where  $C_i$ 's are partitions of  $C'_x$  of (almost) equal size.

# Application in Random Testing

## Idea

- ▶ feed huge inputs to the system  
(guaranteed crash on huge input)
- ▶ simplify input
- ▶ present the simplified result as a test-case

# Application in Random Testing

## Examples

- ▶ applied to command UNIX tools
- ▶ FLEX (lexical analyzer): crashed on a test-case of 2121 characters
- ▶ NROFF (document formatter): crashed on a single control character
- ▶ CRTPLOT (plotter output): crashed on single characters 't' or 'f'

# Improvements

- ▶ caching: **save** the test outcomes, use the saved data
- ▶ stop early: define a **criterion to stop** the algorithm, e.g.,
  1. no progress
  2. reaching a certain granularity
  3. upper bound on time
- ▶ use structures, e.g., blocks instead of characters
- ▶ differences vs. circumstances (compare sane with insane)

# What is a Cause?

- ▶ Effect: the failure
- ▶ Cause: an event **preceding** effect,  
**without** which effect would **not** have happened

## Isolating the cause

- ▶ Cause: the **minimal difference** between the worlds with and **without the failure**

## Isolating the cause

- ▶ Cause: the **minimal difference** between the worlds with and **without the failure**
- ▶ Challenge: the world **without failure**: the goal of debugging



## Isolating the cause

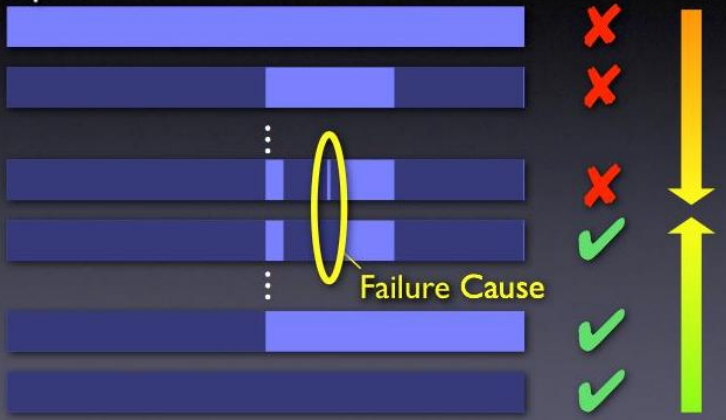
- ▶ Cause: the **minimal difference** between the worlds with and **without the failure**
- ▶ Challenge: the world **without failure**: the goal of debugging
- ▶ Two solutions:
  1. **manipulate** the world by a **debugger**: turn infected to sane
  2. use **another test-case** in which no fault appears

## Isolating: The Sorting Program Case

1. ./sample produces a **failure** on 5 4 3 666666
2. works **fine** on 5 4 3
3. find combinations of
  - 3.1 states of **1 with 2** such that the program **passes**
  - 3.2 states of **2 with 1** such that the program **fails**
4. the **difference** between the two leads to **a cause**

# Isolating

Input



## Delta Debugging: The Algorithm

Start from:

- ▶  $C_{\checkmark} = \emptyset$ : passing circumstances and
  - ▶  $C_{\times}$ : failing circumstances
1. compute the **difference**  $\Delta$  between the failing and the passing circ., **divide** into  $n$  parts:  $\Delta_j$ ,

## Delta Debugging: The Algorithm

Start from:

- ▶  $C_{\checkmark} = \emptyset$ : passing circumstances and
  - ▶  $C_{\times}$ : failing circumstances
1. compute the **difference**  $\Delta$  between the failing and the passing circ., **divide** into  $n$  parts:  $\Delta_j$ ,
  2. **remove**  $\Delta_j$  from the **failing** circ.; it is the new **passing** circ., if it **passes**

## Delta Debugging: The Algorithm

Start from:

- ▶  $C_{\checkmark} = \emptyset$ : passing circumstances and
  - ▶  $C_{\times}$ : failing circumstances
1. compute the **difference**  $\Delta$  between the failing and the passing circ., **divide** into  $n$  parts:  $\Delta_i$ ,
  2. **remove**  $\Delta_i$  from the **failing** circ.; it is the new **passing** circ., if it **passes**
  3. **add**  $\Delta_i$  to the **passing** circ.; it is the new **failing** circ., if it **fails**
  4. **add**  $\Delta_i$  to the **passing** circ.; it is the new **passing** circ., if it **passes**
  5. **remove**  $\Delta_i$  from the **failing** circ.; it is the new **failing** circ., if it **fails**

## Delta Debugging: The Algorithm

Start from:

- ▶  $C_{\checkmark} = \emptyset$ : passing circumstances and
  - ▶  $C_{\times}$ : failing circumstances
1. compute the **difference**  $\Delta$  between the failing and the passing circ., **divide** into  $n$  parts:  $\Delta_i$ ,
  2. **remove**  $\Delta_i$  from the **failing** circ.; it is the new **passing** circ., if it **passes**
  3. **add**  $\Delta_i$  to the **passing** circ.; it is the new **failing** circ., if it **fails**
  4. **add**  $\Delta_i$  to the **passing** circ.; it is the new **passing** circ., if it **passes**
  5. **remove**  $\Delta_i$  from the **failing** circ.; it is the new **failing** circ., if it **fails**
  6. **increase**  $n$  if **none** of the above holds

## Delta Debugging: The Algorithm

Start from:

- ▶  $C_{\checkmark} = \emptyset$ : passing circumstances and
  - ▶  $C_{\times}$ : failing circumstances
1. compute the **difference**  $\Delta$  between the failing and the passing circ., **divide** into  $n$  parts:  $\Delta_i$ ,
  2. **remove**  $\Delta_i$  from the **failing** circ.; it is the new **passing** circ., if it **passes**
  3. **add**  $\Delta_i$  to the **passing** circ.; it is the new **failing** circ., if it **fails**
  4. **add**  $\Delta_i$  to the **passing** circ.; it is the new **passing** circ., if it **passes**
  5. **remove**  $\Delta_i$  from the **failing** circ.; it is the new **failing** circ., if it **fails**
  6. **increase**  $n$  if **none** of the above holds
  7. **repeat** until the difference is a **singleton**



## Delta Debugging: Algorithm

$dd(C_{\checkmark}, C_{\times}, 2)$ ,

where  $ddmin(C'_{\checkmark}, C'_{\times}, n)$  is defined recursively as:

$$\left\{ \begin{array}{ll} (C'_{\checkmark}, C'_{\times}) & \text{if } |\Delta| = 1, \\ dd(C'_{\times} \setminus \Delta_i, C'_{\times}, 2) & \text{else if } \exists_{i \leq n} \text{test}(C'_{\times} \setminus \Delta_i) = \checkmark \\ dd(C'_{\checkmark}, C'_{\checkmark} \cup \Delta_i, 2) & \text{else if } \exists_{i \leq n} \text{test}(C'_{\checkmark} \cup \Delta_i) = \times \\ dd(C'_{\checkmark} \cup \Delta_i, C'_{\times}, \max(n-1, 2)) & \text{else if } \exists_{i \leq n} \text{test}(C'_{\checkmark} \cup \Delta_i) = \checkmark \\ dd(C'_{\checkmark}, C'_{\times} \setminus \Delta_i, \max(n-1, 2)) & \text{else if } \exists_{i \leq n} \text{test}(C'_{\times} \setminus \Delta_i) = \times \\ dd(C'_{\checkmark}, C'_{\times}, \min(2n, |\Delta|)) & \text{else if } n < |\Delta| \\ (C'_{\checkmark}, C'_{\times}) & \text{otherwise} \end{array} \right.$$

where  $\Delta = C'_{\times} \setminus C'_{\checkmark}$  and  $\Delta_i$ 's are  $n$  partitions of  $\Delta$  of (almost) equal size.

# Delta Debugging: Applied to Test-Case Simplification

Start from:

- ▶  $C_{\checkmark} = \emptyset$ : the empty test-case
- ▶  $C_{\times}$ : the test-case leading to failure
- ▶ Much more efficient than minimizing delta debugging

## Delta Debugging: Applied to Regression Testing

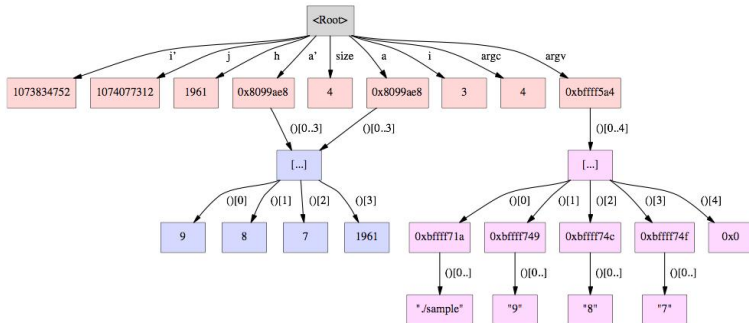
Start from:

- ▶ Goal: find out what went wrong in the new development (the old version worked well)
- ▶  $C_{\checkmark} = \emptyset$ : basis is the old program, no changes needed
- ▶  $C_{\times}$ : difference between the old and the new  
i.e., changes needed to obtain the new program from the old one

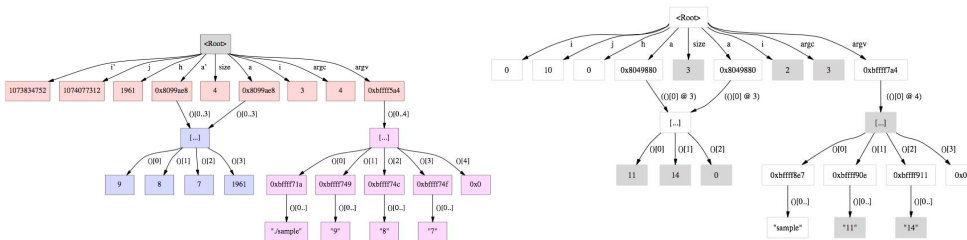
## Isolating the Cause: Idea

- ▶ Capture the state of the program
- ▶ Compare the states of a passes and a failed run
- ▶ The smallest difference  $\Delta$  is the variable causing the problem
- ▶ Find out what influences this variable

# Program State: Memory Graphs



# Comparing the Differences



Implementable as debugger commands,  
e.g., set variable size = 2.

## Isolating the Cause: Implementation

- ▶ Compute the **common subgraph** of the passing and failing memory graphs. Let the difference be  $C_x$ .
- ▶ Implement  $C_x$  as **debugger commands**.
- ▶ Apply delta-debugging to  $C_v = \emptyset$  and  $C_x$ 
  1. Apply differences to the memory graphs and test.
  2. At each step of  $dd$  if the changed state is not a valid state (program does not run), return ?, if it is a valid state, return the result of the test,
- ▶ The result  $\Delta$  leads to a cause.

## Isolating the Cause: Sorting Case

Run the algorithm before calling `shell_sort` with the state of `./sample 7 8 9` as passing and `./sample 11 14` as failing.

If 0 at the state: test fails  $\times$ , passes  $\checkmark$  otherwise.

1.  $C_{\times} = \{ a[], i, size, argc, argv[] \}$ ,  $C_{\checkmark} = \emptyset$ .
2. new failing state: `a[], argv[1]`  $\times$
3. new passing state: `argv[1]`  $\checkmark$
4. new passing state: `a[0]`  $\checkmark$
5. new passing state: `a[0]` and `a[1]`  $\checkmark$
6.  $\Delta = \{ a[2] \}$



## Isolating the Cause: Illustrated Case

■ =  $\delta$  is applied, □ =  $\delta$  is *not* applied

#	$a'[0]$	$a[0]$	$a'[1]$	$a[1]$	$a'[2]$	$a[2]$	$argc$	$argv[1]$	$argv[2]$	$argv[3]$	$i$	$size$	Output	Test
1	□	□	□	□	□	□	□	□	□	□	□	□	7 8 9	✓
2	■	■	■	■	■	■	■	■	■	■	■	■	0 11	✗
3	■	■	■	■	■	■	□	□	□	□	□	□	0 11 14	✗
4	■	■	■	□	□	□	□	□	□	□	□	□	7 11 14	?
5	□	□	□	■	■	■	□	□	□	□	□	□	0 9 14	✗
6	□	□	□	■	□	□	□	□	□	□	□	□	7 9 14	?
7	□	□	□	□	■	■	□	□	□	□	□	□	0 8 9	✗
8	□	□	□	□	■	□	□	□	□	□	□	□	0 8 9	✗
Result					■									

## Isolating the Chain of Causes

- ▶ Apply delta-debugging at the start, determine the minimal passing and running state
- ▶ Choose a common point (e.g., a function call) in the middle
- ▶ Apply delta-debugging on the states of the minimal passing and failing run
- ▶ Repeat the algorithm with the rest of the program and the new passing and failing states

## Finding the Culprits

- ▶ The previous algorithm gives different  $\Delta$ 's (causes at different points)
- ▶ Track the change of causes
- ▶ A smelling point:  $a$  ceases to be a cause and  $b$  becomes a cause

# Automated Debugging

- ▶ A natural mechanization of simple debugging principles
- ▶ Provides (partial) solutions to
  1. testing,
  2. simplifying the test-cases,
  3. isolating the causes and
  4. isolating the cause-effect chain.

## Notes on the Reading Material

- ▶ Covered: Chapters 5, 13 (apart from 13.6) and 14
- ▶ Chapters 1 and 12 provide background information
- ▶ Andreas Zeller's slides are also a very good source (see web page)
- ▶ Igor command-line tool can be downloaded from `www.askigor.org` (unfortunately, the debugging web-service is closed by now)