
An overview of SLAM

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Deduction and Verification Techniques

Session 5

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Overview of the session

- The SLAM loop

- SLAM components:

- C2BP
- Bebop
- Newton
- Constrain

Overview of SLAM

SLAM loop (for proving safety properties) [CEGAR loop]:

1. Run **C2BP** to construct Boolean Program BP
[Predicate abstraction]
2. Run **Bebop** on BP. If no counterexample **OK**
[Boolean techniques]
3. If counterexample run **Newton** to check feasibility.
If feasible, then **BUG**
4. If infeasible, infer new predicates to rule out counterexample
[Interpolants?]
5. If new predicates found, goto 1
6. Else, call **Constrain** and goto 2
[Theorem proving]

Obvious remark: it may not terminate

Running example

Proving that the following program is **correct**

$$\{Pre: x = 5 \wedge y > x \}$$

$x := y;$

$$\{Post: x \neq 5 \}$$

is equivalent to proving that **ERROR** is not reachable in:

$assume(x = 5 \wedge y > x);$

$x := y;$

if $x=5$

ERROR;

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First step: C2BP (C to Boolean Program)

Underlying idea: PREDICATE ABSTRACTION

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 $P = [x > 2, x + y < 1, z = x]$

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- Assume one is given the predicates

$$P = [x > 2, x + y < 1, z = x]$$

- | CONCRETE STATE | ABSTRACT STATE |
|----------------------------|----------------|
| $\{x = 5, y = 2, z = -1\}$ | $\{1, 0, 0\}$ |

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how do the states change, i.e. which is the transition relation?

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- | CONCRETE STATE | ABSTRACT STATE |
|----------------------------|----------------|
| $\{x = 6, y = 2, z = -1\}$ | $\{?, ?, ?\}$ |

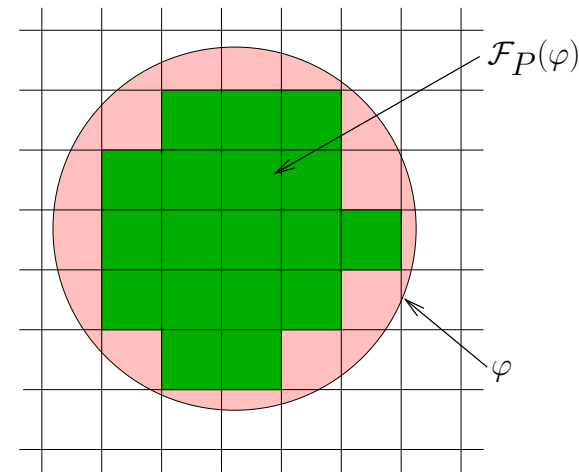
Predicate abstraction - Key operation

PREDICATE ABSTRACTION-KEY OPERATION:

- **INPUT:**
 - A theory T
 - A formula φ (representing, e.g., a set of concrete states)
 - A set of predicates $P = \{P_1, \dots, P_n\}$ describing some set of properties of the system state
- **OUTPUT:** the most precise T -approximation of φ using P

This amounts to compute either

- $\mathcal{F}_P(\varphi)$: the **weakest** Boolean expression over P that **T -implies** φ ,
or
- $\mathcal{G}_P(\varphi)$: the **strongest** Boolean expression over P **T -implied** by φ



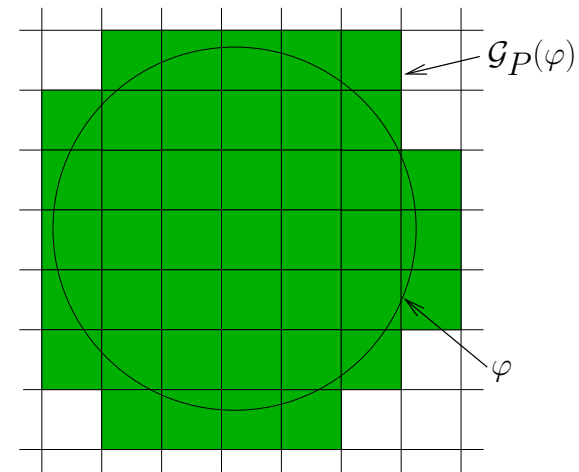
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Predicate abstraction - Computation

Some notation:

- A **cube** is a conjunction of literals of P .
- A **minterm** is a cube of size $|P|$ with exactly one of P_i or $\neg P_i$.

The computation of $\mathcal{F}_P(\varphi)$ and $\mathcal{G}_P(\varphi)$ is given by:

- $\mathcal{F}_P(\varphi)$ is $\bigvee \{c \mid c \text{ is a minterm over } P \text{ and } c \models_T \varphi\}$,
- $\mathcal{G}_P(\varphi)$ is $\neg \mathcal{F}_P(\neg \varphi)$.
- $\mathcal{G}_P(\varphi)$ is $\bigvee \{c \mid c \text{ is a minterm over } P \text{ and } c \wedge \varphi \text{ is } T\text{-satisfiable}\}$,

ALGORITHM:

Check, for each minterm c , whether $c \wedge \varphi$ is T -satisfiable.

First step: C2BP (2)

INPUT:

- C program with a set of ERROR locations
 - loops are transformed to if + goto
 - procedure calls are allowed
 - pointers are allowed
- A set of predicates $P = [p_1, \dots, p_n]$.

OUTPUT:

- A boolean program BP such that
 - the only variables are b_1, \dots, b_n
 - maintains the flow structure of the C program
 - if ERROR is not reachable in BP, it is not reachable in the C program either

First step: C2BP (3)

We will make use of the function:

```
bool choose (bool b1, bool b2) {  
    if (b1) return true;  
    if (b2) return false;  
    return undeterministic_choose();  
}
```

First step: C2BP (4)

Assume one is given the set of predicates $P = [x > 5, x < 5, y = 5]$ and the **C** program:

```
assume( $x = 5 \wedge y > x$ );  
x:=y;  
if x=5  
  ERROR::;
```

The **BP** obtained is the following:

```
assume( $\mathcal{G}_P(x = 5 \wedge y > x)$ );  
<  $b_1, b_2, b_3$  > := < choose( $\mathcal{F}_P(WP(x:=y, x > 5))$ ) ,  $\mathcal{F}_P(WP(x:=y, x <= 5))$ ),  
  choose( $\mathcal{F}_P(WP(x:=y, x < 5))$ ) ,  $\mathcal{F}_P(WP(x:=y, x >= 5))$ ),  
  choose( $\mathcal{F}_P(WP(x:=y, y = 5))$ ) ,  $\mathcal{F}_P(WP(x:=y, y \neq 5))$ ) >  
if (*){  
  assume( $\mathcal{G}_P(x = 5)$ );  
  ERROR:: };
```

First step: C2BP(5)

Assume one is given the set of predicates $P = [x > 5, x < 5, y = 5]$ and the **C** program:

```
assume( $x = 5 \wedge y > x$ );  
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The **BP** obtained is the following:

```
assume( $\neg b_1 \wedge \neg b_2 \wedge \neg b_3$ );  
<  $b_1, b_2, b_3$  > := < choose(false,  $b_3$ ),  
                        choose(false,  $b_3$ ),  
                        choose( $b_3, \neg b_3$ ) >  
if (*){  
  assume( $\neg b_1 \wedge \neg b_2$ );  
  ERROR:: }  
}
```

Overview of the session

- The SLAM loop
- SLAM components:
 - C2BP
 - **Bebop**
 - Newton
 - Constrain

Second step: BEBOP - Model check BP

QUESTION: Is ERROR reachable in the boolean program?

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assume( $\neg b_1 \wedge \neg b_2 \wedge \neg b_3$ );  
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if (*) {  
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if (*) {  
  assume( $\neg b_1 \wedge \neg b_2$ );  
  ERROR;; }  
}
```

ANSWER: YES!!!!

- Any program execution assigns b_3 to false, but arbitrary values to b_1 and b_2 .
- Hence, a trace in which both b_1 and b_2 are assigned to *false* is possible and leads to ERROR

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Third step: Newton - path feasibility

Let's consider the path to ERROR in the original C program:

| | VAR | VAL | CONSTR. |
|--------------------|-----|------------|---------|
| 1. $x := x_\theta$ | x | x_θ | |

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| 3. $\text{assume}(x=5)$ | | | $x_\theta = 5$ |

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| 4. $\text{assume}(y > x)$ | | | $y_\theta > x_\theta$ |

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| 4. $\text{assume}(y > x)$ | | | $y_\theta > x_\theta$ |
| 5. $x := y;$ | x | y_θ | |
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| 3. $\text{assume}(x=5)$ | | | $x_\theta = 5$ |
| 4. $\text{assume}(y > x)$ | | | $y_\theta > x_\theta$ |
| 5. $x := y;$ | x | y_θ | |
| 6. $\text{assume}(x=5)$ | | | $y_\theta = 5$ |

NEWTON ACHIEVES TWO GOALS:

- **Detects** that the set of constrains is **inconsistent** (abstract path is infeasible)
- **Generates** the **predicates** $\{x = 5, y > x, y = 5\}$

First step again: C2BP

- Now the set of predicates is the original one

$$[x > 5, x < 5, y = 5]$$

plus the newly generated ones

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- **QUESTION:** Do they rule out all the previous path?

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- **ANSWER:** YES

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- **ANSWER:** YES

- **QUESTION:** Are all of them necessary?

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$$[x > 5, x < 5, y = 5]$$

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$$[x = 5, y > x, y = 5].$$

- **QUESTION:** Do they rule out all the previous path?

- **ANSWER:** YES

- **QUESTION:** Are all of them necessary?

- **ANSWER:** NO

Step 1 again: C2BP(2)

The abstraction w.r.t. the **new predicates** $P = [x = 5, y > x, y = 5]$ is

```
assume( $b_1 \wedge b_2 \wedge \neg b_3$ );  
<  $b_1, b_2, b_3$  > := < choose( $b_3, \neg b_3$ ),  
                        choose(false, true),  
                        choose( $b_3, \neg b_3$ ) >  
if (*) {  
  assume( $b_1$ );  
  ERROR;; }  
}
```

- Now, clearly **ERROR is not reachable**.
- Hence, not all predicates are needed to prove property!
- BLAST approach is better in this sense

Possible problems: No Difference Found

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Possible problems: No Difference Found

- Sometimes Newton is not able to generate new predicates
- At that point, iterative refinement cannot make any more progress
- What is the reason?
- The set of predicates may suffice to rule out infeasible abstract path, but
 - Computation of $\mathcal{G}_P(\varphi)$ or $\mathcal{F}_P(\varphi)$ might be inaccurate
 - SLAM abstract transition relation computation is not exact (both in practice and in theory)

Cartesian approx. vs. exact computation

SLAM Boolean abstraction of the C program was the following:

```
assume( $\neg b_1 \wedge \neg b_2 \wedge \neg b_3$ );  
<  $b_1, b_2, b_3$  > := < choose(false,  $b_3$ ),  
                        choose(false,  $b_3$ ),  
                        choose( $b_3, \neg b_3$ ) >
```

```
if (*){  
  assume( $\neg b_1 \wedge \neg b_2$ );  
  ERROR;; }  
}
```

● Which are the reachable abstract states before reaching **if**?

● Reachable states are:

● $\{0, 0, 0\}$ (ERROR!)

● $\{0, 1, 0\}$

● $\{1, 0, 0\}$

● $\{1, 1, 0\}$

Cartesian approx. vs. exact comput. (3)

Let's compute the reachable abstract states in a different way:

```
assume( $x = 5 \wedge y > x$ );
```

```
x:=y;
```

```
if x=5
```

```
  ERROR::
```

Reachable concrete states before **if** can be described as

$$\{(x_1, y_0) \mid x_0 = 5 \wedge y_0 > x_0 \wedge x_1 = y_0\}$$

If we know take $P = \{x_1 < 5, x_1 > 5, y_0 = 5\}$ we can compute the reachable abstract states as

$$\mathcal{G}_P(x_0 = 5 \wedge y_0 > x_0 \wedge x_1 = y_0)$$

which is exactly $\{0, 1, 0\}$.

Hence, the abstract bad state $\{0, 0, 0\}$ is indeed **NOT** reachable.

Cartesian approx. vs. exact comput. (2)

- Cartesian approximation is **not 100% precise**
- However, it seems very **good in practice**(cheap and quite precise)
- In some cases, due to the loss of precision, Newton cannot make progress
- In those situations, **Constrain** is called

Overview of the session

- The SLAM loop
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 - Bebop
 - Newton
 - **Constrain**

Fourth step: Constrain - Tr. relat. refin.

INPUT:

- C program
- Boolean abstraction
- Trace through the Boolean abstraction (valuation of predicates at each step)

OUTPUT:

- Set of constrains to be added to the Boolean abstraction

IDEA:

Transition from abstract state A_i to A_{i+1} using instr. i spurious if

$$\gamma(A_i) \rightarrow \neg WP(I_i, \gamma(A_{i+1}))$$

is valid (where γ is the concretization function).

Fourth step: Constrain (2)

Let's revisit our example (predicates were $P = [x > 5, x < 5, y = 5]$):

C program

I_1 : `assume(x = 5 \wedge y > x);`

I_2 `x:=y;`

I_3 `if x=5`
`ERROR;;`

Boolean trace

$A_0 = \{0, 0, 0\}$

(I_1)

$A_1 = \{0, 0, 0\}$

(I_2)

$A_2 = \{0, 0, 0\}$

(I_3) *//assume (x=5)*

$A_3 = \{0, 0, 0\}$

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Let's revisit our example (predicates were $P = [x > 5, x < 5, y = 5]$):

| C program | Boolean trace |
|---|--|
| I_1 : assume($x = 5 \wedge y > x$); | $A_0 = \{0, 0, 0\}$ (I_1) |
| I_2 $x:=y$; | $A_1 = \{0, 0, 0\}$ (I_2) |
| I_3 if $x=5$ ERROR ::; | $A_2 = \{0, 0, 0\}$ (I_3) //assume ($x=5$) $A_3 = \{0, 0, 0\}$ |

$\gamma(A_0) \rightarrow \neg WP(I_1, \gamma(A_1))$ is valid?

$x = 5 \wedge y \neq 5 \rightarrow \neg WP(\text{assu.}(x = 5 \wedge y > x), x = 5 \wedge y \neq 5)$ is valid?

$x = 5 \wedge y \neq 5 \rightarrow \neg(x = 5 \wedge y \neq 5)$ valid? NO! ($A_0 \rightsquigarrow A_1$ not spur.).

Fourth step: Constrain (2)

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| C program | Boolean trace |
|--|--|
| $I_1 : \text{assume}(x = 5 \wedge y > x);$ | $A_0 = \{0, 0, 0\}$ (I_1) |
| $I_2 \text{ } x:=y;$ | $A_1 = \{0, 0, 0\}$ (I_2) |
| $I_3 \text{ if } x=5$ | $A_2 = \{0, 0, 0\}$ |
| ERROR; | $(I_3) \text{ //assume } (x=5)$ $A_3 = \{0, 0, 0\}$ |

$\gamma(A_1) \rightarrow \neg WP(I_2, \gamma(A_2))$ is valid?

$x = 5 \wedge y \neq 5 \rightarrow \neg WP(x := y, x = 5 \wedge y \neq 5)$ is valid?

$x = 5 \wedge y \neq 5 \rightarrow \neg(y = 5 \wedge y \neq 5)$ valid? YES! ($A_1 \rightarrow A_2$ is spur.).

BEBOP will get the constrain $\neg(\neg b_1 \wedge \neg b_2 \wedge \neg b_3 \wedge \neg b'_1 \wedge \neg b'_2 \wedge \neg b'_3)$

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|---|--|
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$\gamma(A_2) \rightarrow \neg WP(I_3, \gamma(A_3))$ is valid?

$x = 5 \wedge y \neq 5 \rightarrow \neg WP(\text{assu.}(x = 5 \wedge y > x), x = 5 \wedge y \neq 5)$ is valid?

$x = 5 \wedge y \neq 5 \rightarrow \neg(x = 5 \wedge y \neq 5)$ valid? NO! ($A_2 \rightarrow A_3$ not spur.).

BEBOP again

After **Constrain**, BEBOP will get the Boolean program:

```
assume( $\neg b_1 \wedge \neg b_2 \wedge \neg b_3$ );  
<  $b_1, b_2, b_3$  > := < choose(false,  $b_3$ ),  
                        choose(false,  $b_3$ ),  
                        choose( $b_3, \neg b_3$ ) > //with constrain  
                                                 $\neg(\{0, 0, 0\} \rightarrow \{0, 0, 0\})$   
  
if (*){  
    assume( $\neg b_1 \wedge \neg b_2$ );  
    ERROR;; }
```

- Now clearly **ERROR is not reachable**
- We have proven the program correct **WITHOUT** adding new predicates

Overview of SLAM

SLAM loop (for proving safety properties):

1. Run **C2BP** to construct Boolean Program BP
[Predicate abstraction]
2. Run **Bebop** on BP. If no counterexample **OK**
[Boolean techniques]
3. If counterexample run **Newton** to check feasibility.
If feasible, then **BUG**
4. If infeasible, infer new predicates to rule out counterexample
[Interpolants?]
5. If new predicates found, goto 1
6. Else, call **Constrain** and goto 2
[Theorem proving]

Obvious remark: it may not terminate

Bibliography - Some further reading

All papers can be found at:

- <http://research.microsoft.com/en-us/projects/slam/>