

# Weakest Precondition Reasoning and Its Generalizations

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05.03.2026



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- ▶ Research interests: program verification, weighted programming



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- ▶ Group: Software Modeling and Verification & Quantum Information Systems
- ▶ Research interests: program verification, quantum computing

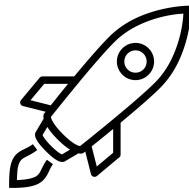
1. Classical programs - Boolean predicates
2. Probabilistic programs - Quantitative predicates
3. Probabilistic programs - Expectations
4. Break
5. Weighted programs - Expectations
6. Quantum programs - Observables

# Example: Rocket Landing

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We need to check some things before landing

- ▶ Fuel level
- ▶ Engine temperature
- ▶ Fuel pressure
- ▶ ...



# Program for Rocket Landing

---

```
while (fuel > 100) {  
    fuel := fuel - 10  
};  
if (engineTemp > 900){  
    engineOn := False  
}  
else {  
    engineOn := True  
};  
fuelPressure := fuelPressure + 50
```



# Program for Rocket Landing

---

```
while (fuel > 100) {
    fuel := fuel - 10
};
if (engineTemp > 900){
    engineOn := False
}
else {
    engineOn := True
};
fuelPressure := fuelPressure + 50
```



Postcondition:

```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

# Program for Rocket Landing

Precondition:

```
// ?
```

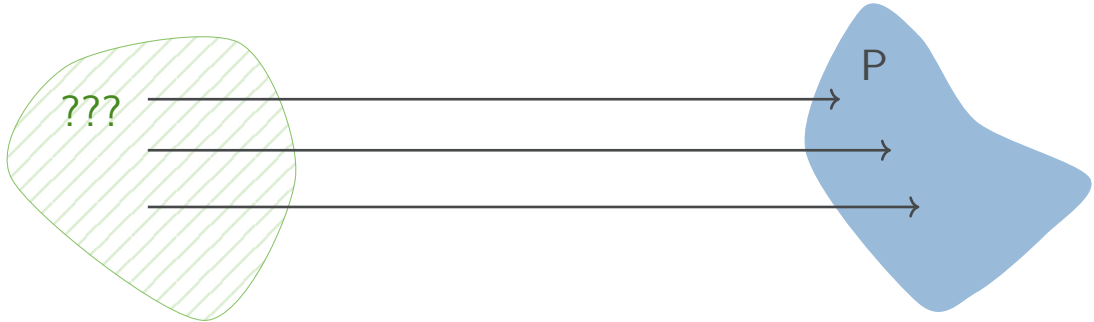
```
while (fuel > 100) {  
    fuel := fuel - 10  
};  
if (engineTemp > 900){  
    engineOn := False  
}  
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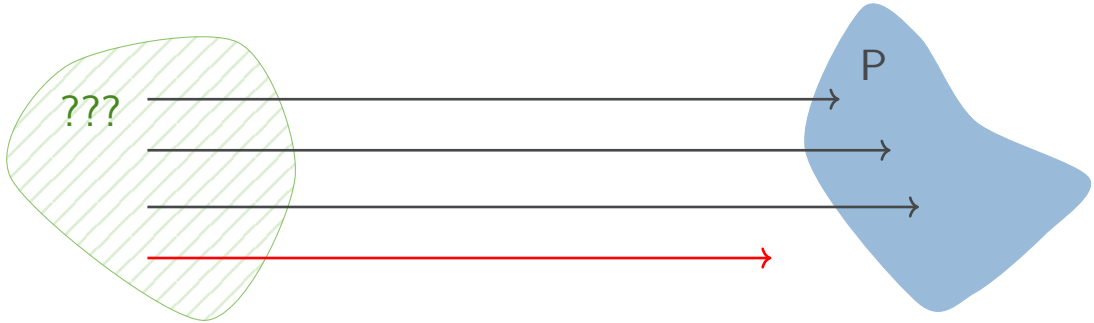
Postcondition:

```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

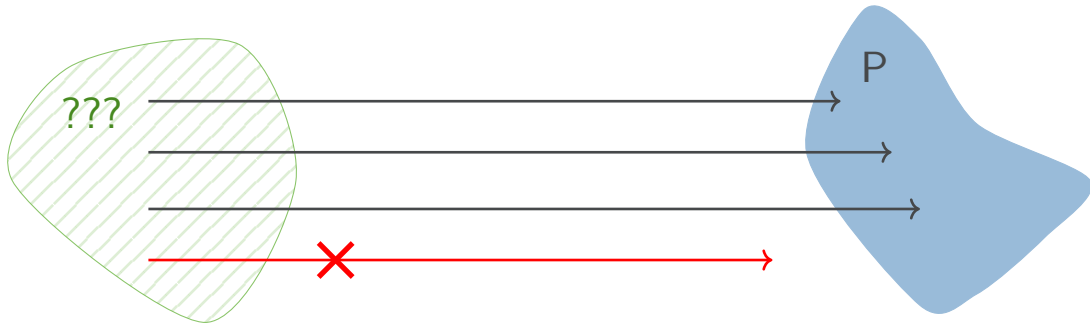
program  $S$



program  $S$



program  $S$





Recall example program for rocket landing

```
fuelPressure := fuelPressure + 50
```



Recall example program for rocket landing

```
fuelPressure := fuelPressure + 50
```

```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```



Recall example program for rocket landing

What property needs to hold before program execution to ensure the postcondition?

```
fuelPressure := fuelPressure + 50
```

```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```



Recall example program for rocket landing

What property needs to hold before program execution to ensure the postcondition?

```
// [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]  
// [fuelPressure + 50 > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

```
fuelPressure := fuelPressure + 50
```

```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

```
if (engineTemp > 900){
```

```
    engineOn := False
```

```
}
```

```
else {
```

```
    engineOn := True
```

```
};
```

```
// [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

```

if (engineTemp > 900){

    engineOn := False
    // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
}
else {

    engineOn := True
    // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
};
// [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]

```

```

if (engineTemp > 900){

    engineOn := False
    // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
}
else {
    // [fuelPressure > 450 ∧ True = True ∧ 50 ≤ fuel ≤ 100]
    engineOn := True
    // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
};
// [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]

```

```

if (engineTemp > 900){
  // [fuelPressure > 450 ∧ False = True ∧ 50 ≤ fuel ≤ 100]
  engineOn := False
  // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
}
else {
  // [fuelPressure > 450 ∧ True = True ∧ 50 ≤ fuel ≤ 100]
  engineOn := True
  // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
};
// [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]

```

```

// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
// [(engineTemp > 900 ∧ False) ∨
  (engineTemp ≠ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100)]
if (engineTemp > 900){
  // [fuelPressure > 450 ∧ False = True ∧ 50 ≤ fuel ≤ 100]
  engineOn := False
  // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
}
else {
  // [fuelPressure > 450 ∧ True = True ∧ 50 ≤ fuel ≤ 100]
  engineOn := True
  // [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
};
// [fuelPressure > 450 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]

```

program $S$	$\text{wp}[[S]](P)$
$x := E$	$P[x/E]$
$\text{if } (\varphi) \{ S_1 \} \text{ else } \{ S_2 \}$	$(\varphi \wedge \text{wp}[[S_1]](P)) \vee (\neg\varphi \wedge \text{wp}[[S_2]](P))$
$S_1 ; S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](P))$
$\text{while } (\varphi) \{ S \}$	?

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

# Loops

---

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [50 ≤ fuel ≤ 100]
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

# Loops

---

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [50 ≤ fuel ≤ 100]
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

# Loops

---

```
// [50 ≤ fuel]
```

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [50 ≤ fuel ≤ 100]
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

# Loops

```
// [50 ≤ fuel]
```

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [50 ≤ fuel ≤ 100]
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

How can we compute it?

# Loops

```
// [50 ≤ fuel]
```

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [50 ≤ fuel ≤ 100]
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

How can we compute it?

**Idea:** Unroll loop backwards,

$$\Phi(X) = [50 \leq \text{fuel} \leq 100] \vee ([\text{fuel} > 100] \wedge \text{wp}[[\text{fuel} := \text{fuel} - 10]](X))$$

# Loops

```
// [50 ≤ fuel]
```

```
while (fuel > 100) {  
    fuel := fuel - 10  
}
```

```
// [50 ≤ fuel ≤ 100]
```

```
// [engineTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel ≤ 100]
```

How can we compute it?

**Idea:** Unroll loop backwards,

$\Phi(X) = [50 \leq fuel \leq 100] \vee ([fuel > 100] \wedge \text{wp}[[fuel := fuel - 10]](X))$

generally:  $\Phi(X) = (\neg\varphi \wedge P) \vee (\varphi \wedge \text{wp}[[S]](X))$

$\Phi^n(X) \equiv \text{wp}$  of  $n$ -times executing the loop on the empty set of states

$$\Phi(X) = [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \mathbf{wp}[[fuel := fuel - 10]](X))]$$

$$\Phi(X) = [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \mathbf{wp}[[fuel := fuel - 10]](X))]$$

$$\begin{aligned}\Phi^1(\mathbf{False}) &= [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \mathbf{wp}[[fuel := fuel - 10]](\mathbf{False}))] \\ &= [50 \leq fuel \leq 100]\end{aligned}$$

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$$\begin{aligned}\Phi^2(\text{False}) &= [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \text{wp}[[fuel := fuel - 10]]([50 \leq fuel \leq 100]))] \\ &= [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge [60 \leq fuel \leq 110])] \\ &= [50 \leq fuel \leq 110]\end{aligned}$$

$$\Phi(X) = [50 \leq \text{fuel} \leq 100 \vee (\text{fuel} > 100 \wedge \text{wp}[[\text{fuel} := \text{fuel} - 10]](X))]$$

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$$\begin{aligned}\Phi^3(\text{False}) &= [50 \leq \text{fuel} \leq 110 \vee (\text{fuel} > 110 \wedge \text{wp}[[\text{fuel} := \text{fuel} - 10]]([50 \leq \text{fuel} \leq 110]))] \\ &= [50 \leq \text{fuel} \leq 120]\end{aligned}$$

...

$$\Phi(X) = [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \text{wp}[[fuel := fuel - 10]](X))]$$

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$$\begin{aligned}\Phi^3(\text{False}) &= [50 \leq fuel \leq 110 \vee (fuel > 110 \wedge \text{wp}[[fuel := fuel - 10]]([50 \leq fuel \leq 110]))] \\ &= [50 \leq fuel \leq 120]\end{aligned}$$

...

$$\Phi^n(\text{False}) = [50 \leq fuel \leq 100 + 10(n - 1)]$$

$$\Phi(X) = [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \text{wp}[[fuel := fuel - 10]](X))]$$

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...

$$\Phi^n(\text{False}) = [50 \leq fuel \leq 100 + 10(n - 1)]$$

$$\sup_n \Phi^n(\text{False}) = [50 \leq fuel] = \text{lfp } X.\Phi(X)$$

$$\Phi(X) = [50 \leq fuel \leq 100 \vee (fuel > 100 \wedge \text{wp}[[fuel := fuel - 10]](X))]$$

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...

$$\Phi^n(\text{False}) = [50 \leq fuel \leq 100 + 10(n - 1)]$$

$$\sup_n \Phi^n(\text{False}) = [50 \leq fuel] = \text{lfp } X.\Phi(X)$$

$$\text{wp}[\text{while } (\varphi) \{S\}](P) = \text{lfp } X.(\varphi \wedge \text{wp}[[S]](X)) \vee (\neg\varphi \wedge P)$$

program $S$	$\text{wp}[[S]](P)$
$x := E$	$P[x/E]$
$\text{if } (\varphi) \{ S_1 \} \text{ else } \{ S_2 \}$	$(\varphi \wedge \text{wp}[[S_1]](P)) \vee (\neg\varphi \wedge \text{wp}[[S_2]](P))$
$S_1 ; S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](P))$
$\text{while } (\varphi) \{ S \}$	$\text{lfp } X. (\varphi \wedge \text{wp}[[S]](X)) \vee (\neg\varphi \wedge P)$

- ▶ Tool for deductive verification of (probabilistic) programs by RWTH Aachen University
- ▶ Given a program  $S$ , a precondition  $Q$  and a postcondition  $P$ , compute  $\text{wp}[[S]](P)$  and check if it implies a given precondition  $Q$ , i.e. if  $Q$  is a valid precondition

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We want to use it to verify that our computations are correct.

1. Install Caesar

<https://www.caesarverifier.org> (easiest using VSCode)

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We want to use it to verify that our computations are correct.

1. Install Caesar  
<https://www.caesarverifier.org> (easiest using VSCode)
2. Open `rocket_landing_bool.heyvl`  
<https://rwth-aachen.sciebo.de/s/aKYC3EBGy7TPoPX>



caesar > ( rocket\_landing\_bool.heyvl

```
✓ 1  coproc rocket(init_fuel: UInt, init_engineTemp: UInt, init_fuelPressure: UInt) -> (fuel:
    UInt, engineTemp: UInt, fuelPressure: UInt, engineOn: Bool)
2  |   pre [50<=init_fuel && init_fuelPressure > 450 && init_engineTemp <=900]
3  |   post [fuelPressure > 500 && engineOn == true && 50 <= fuel && fuel <= 100]
4  |   {
5  |     fuel = init_fuel
6  |     engineTemp = init_engineTemp
7  |     fuelPressure = init_fuelPressure
8  |     @invariant([50<=fuel && fuelPressure > 450 && engineTemp <=900])
9  |     while fuel > 100 {
10 |       fuel = fuel-10
11 |     }
12 |     if engineTemp > 900 {
13 |       engineOn = false
14 |     } else {
15 |       engineOn = true
16 |     }
17 |     fuelPressure = fuelPressure + 50
18 |   }
^^
```



caesar &gt; ( rocket\_landing\_bool.heyvl

```

1  coproc rocket(init_fuel: UInt, init_engineTemp: UInt, init_fuelPressure: UInt) -> (fuel: UInt, engineTemp: UInt,
fuelPressure: UInt, engineOn: Bool)
2  pre [50<=init_fuel && init_fuelPressure > 450 && init_engineTemp <=900]
3  post [fuelPressure > 500 && engineOn == true && 50 <= fuel && fuel <= 100]
4  {
5  ▷ [(50 <= init_fuel) && ((init_fuelPressure > 450) && (init_engineTemp <= 900))]
6  fuel = init_fuel
7  engineTemp = init_engineTemp
8  fuelPressure = init_fuelPressure
9  ▷ [(50 <= fuel) && ((fuelPressure > 450) && (engineTemp <= 900))]
10 @invariant([50<=fuel && fuelPressure > 450 && engineTemp <=900])
11 while fuel > 100 {
12   ▷ [(50 <= (fuel - 10)) && ((fuelPressure > 450) && (engineTemp <= 900))]
13   fuel = fuel-10
14   ▷ [(50 <= fuel) && ((fuelPressure > 450) && (engineTemp <= 900))]
15 }
16 ▷ ite((engineTemp > 900), [(((fuelPressure + 50) > 500) && ((false == true) && ((50 <= fuel) && (fuel <= 100)))]), [(
17 if engineTemp > 900 {
18   ▷ [(((fuelPressure + 50) > 500) && ((false == true) && ((50 <= fuel) && (fuel <= 100)))]
19   engineOn = false
20   ▷ [(((fuelPressure + 50) > 500) && ((engineOn == true) && ((50 <= fuel) && (fuel <= 100)))]
21 } else {
22   ▷ [(((fuelPressure + 50) > 500) && ((true == true) && ((50 <= fuel) && (fuel <= 100)))]
23   engineOn = true
24   ▷ [(((fuelPressure + 50) > 500) && ((engineOn == true) && ((50 <= fuel) && (fuel <= 100)))]
25 }
26 ▷ [(((fuelPressure + 50) > 500) && ((engineOn == true) && ((50 <= fuel) && (fuel <= 100)))]
27 fuelPressure = fuelPressure + 50
28 ▷ [(((fuelPressure > 500) && ((engineOn == true) && ((50 <= fuel) && (fuel <= 100)))]
29
30

```



# Program for Rocket Landing

```
// [fuelPressure > 450 ∧ engineTemp ≤ 900 ∧ 50 ≤ fuel]
```

```
while (fuel > 100) {  
    fuel := fuel - 10  
};  
if (engineTemp > 900){  
    engineOn := False  
}  
else {  
    engineOn := True  
};  
fuelPressure := fuelPressure + 50
```



```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

# Program for Rocket Landing

```
// [fuelPressure > 450 ∧ engineTemp ≤ 900 ∧ 50 ≤ fuel]
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while (fuel > 100) {  
    fuel := fuel - 10  
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if (engineTemp > 900){  
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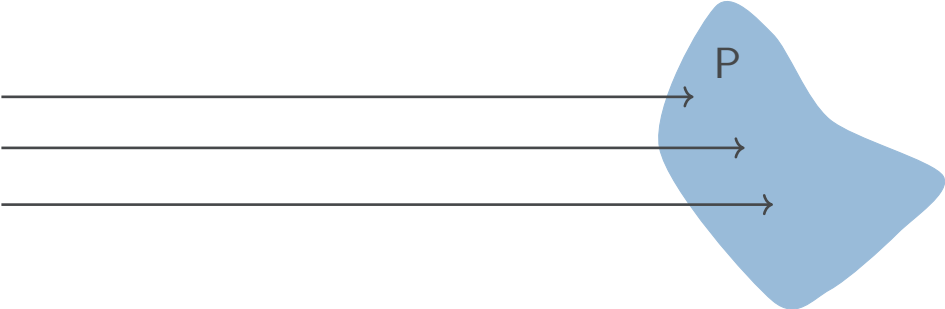
Try variations,  
e.g. which pre  
holds always?



```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

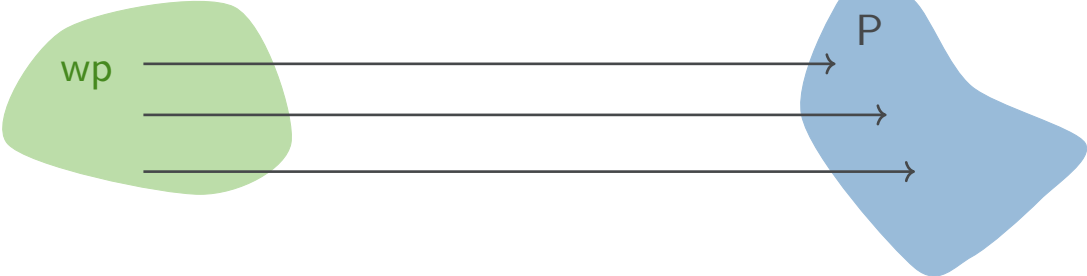
# Diverging Loops

program  $S$



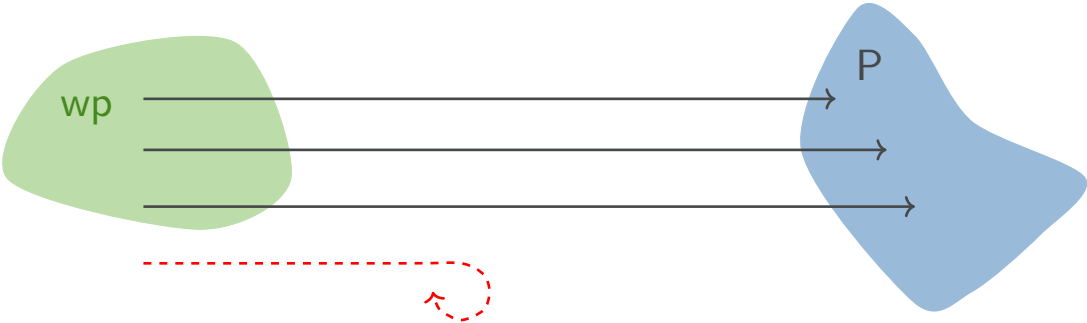
# Diverging Loops

program  $S$



# Diverging Loops

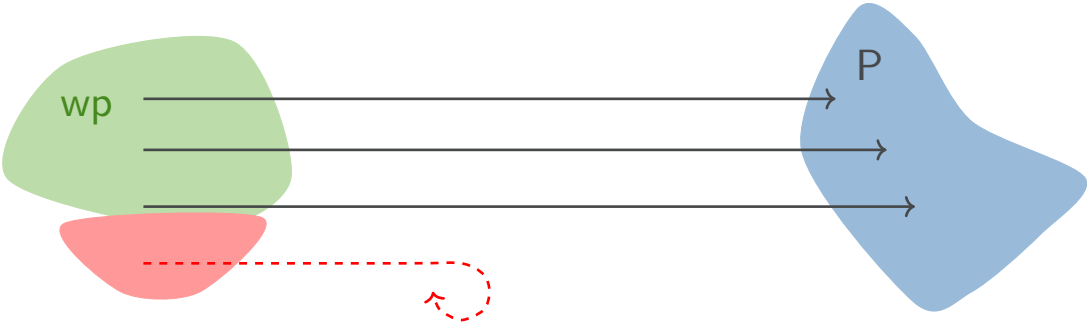
program  $S$



What about diverging loops?

# Diverging Loops

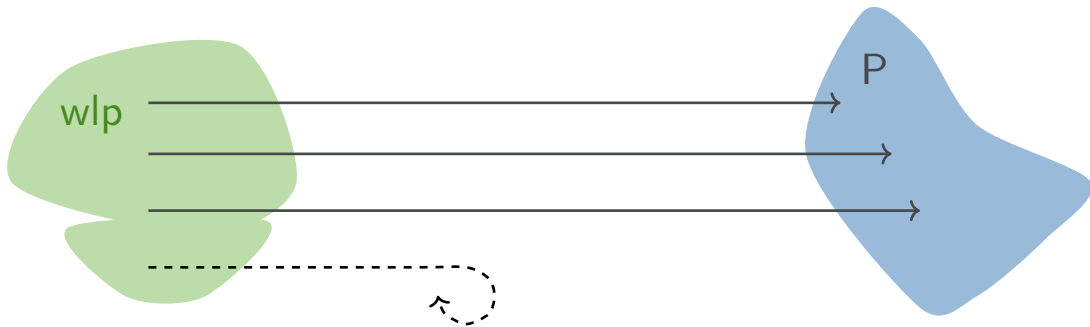
program  $S$



What about diverging loops? currently those initial states are not included

# Diverging Loops

program  $S$



What about diverging loops? currently those initial states are not included

There is a version where they are included: weakest *liberal* preconditions

$$\text{wlp}[\text{while } (\varphi) \{S\}](P) = \text{gfp } X. (\varphi \wedge \text{wlp}[S](X)) \vee (\neg\varphi \wedge P) \vee (\varphi \wedge X)$$

# Add Probabilities

---

Why? E.g. to make the system error-tolerant for sensor issues

```
engineTemp := realTemp [0.95] engineTemp := falseTemp;
```



```
if (engineTemp > 900){  
    engineOn := False  
}  
else {  
    engineOn := True  
};
```

# Add Probabilities

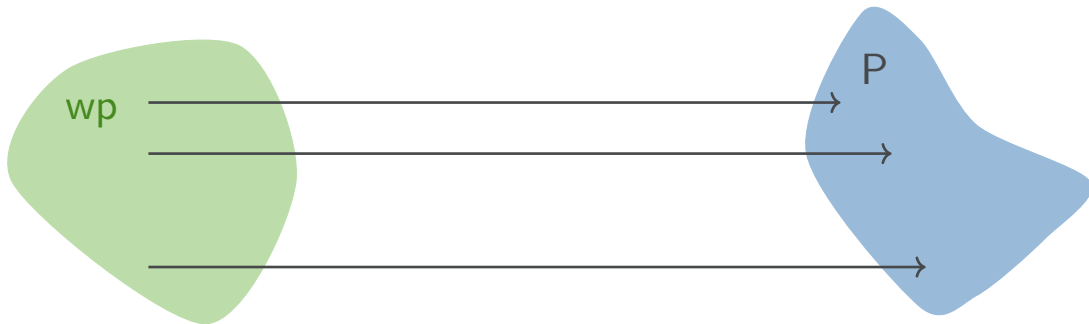
Why? E.g. to make the system error-tolerant for sensor issues

```
// ?  
engineTemp := realTemp [0.95] engineTemp := falseTemp;  
  
// [engineTemp ≤ 900]  
if (engineTemp > 900){  
    engineOn := False  
}  
else {  
    engineOn := True  
};  
  
// [engineOn = True]
```

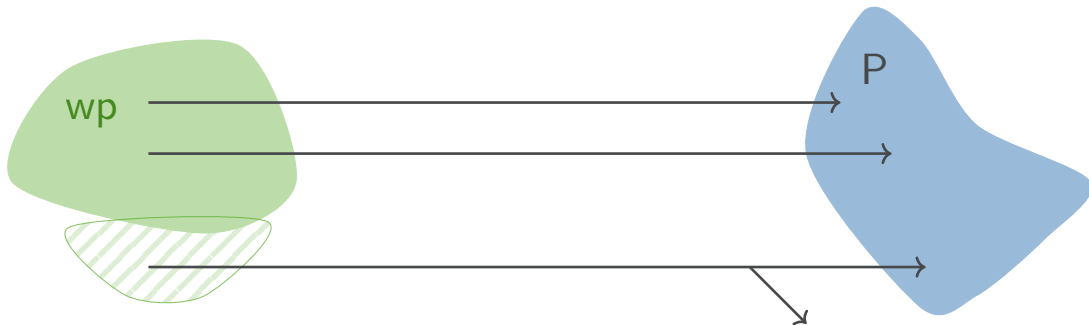


program $S$	$\text{wp}[[S]](P)$
$x := E$	$P[x/E]$
$\text{if } (\varphi) \{ S_1 \} \text{ else } \{ S_2 \}$	$(\varphi \wedge \text{wp}[[S_1]](P)) \vee (\neg\varphi \wedge \text{wp}[[S_2]](P))$
$S_1 \ ; \ S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](P))$
$\text{while } (\varphi) \{ S \}$	$\text{lfp } X. (\varphi \wedge \text{wp}[[S]](X)) \vee (\neg\varphi \wedge P)$
$S_1 [p] S_2$	?

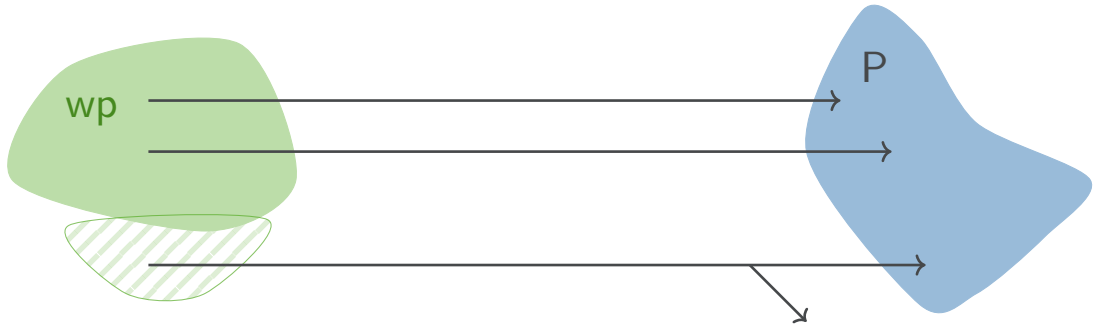
program  $S$



program  $S$

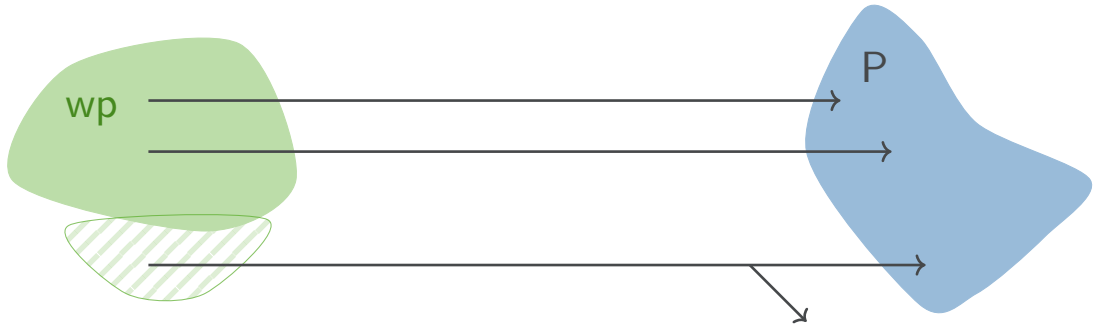


program  $S$



What about probabilistic branching? Only accept states that satisfy  $P$  with probability at least 0.5?

program  $S$



What about probabilistic branching? Only accept states that satisfy  $P$  with probability at least 0.5?

Change type of predicates to  $[0, 1]$ -valued functions

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow [0, 1]$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow [0, 1]$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Probability that  $f$  holds in  $\sigma$

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow [0, 1]$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Probability that  $f$  holds in  $\sigma$

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// [engineTemp ≤ 900]
```



## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow [0, 1]$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Probability that  $f$  holds in  $\sigma$

```
// 0.95 [realTemp ≤ 900] + 0.05 [falseTemp ≤ 900]
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// [engineTemp ≤ 900]
```



## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow [0, 1]$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Probability that  $f$  holds in  $\sigma$

```
// 0.95 [realTemp ≤ 900] + 0.05 [falseTemp ≤ 900]
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// [engineTemp ≤ 900]
```



$$f = 0.95 [\text{realTemp} \leq 900] + 0.05 [\text{falseTemp} \leq 900]$$

$$f(\text{realTemp} = 1000, \text{falseTemp} = 800) = 0.95 \cdot 0 + 0.05 \cdot 1 = 0.05$$

$$f(\text{realTemp} = 800, \text{falseTemp} = 1000) = 0.95 \cdot 1 + 0.05 \cdot 0 = 0.95$$

$$f(\text{realTemp} = 950, \text{falseTemp} = 1000) = 0.95 \cdot 0 + 0.05 \cdot 0 = 0$$

```
if ( $\varphi$ ){
```

```
     $S_1$ 
```

```
}
```

```
else {
```

```
     $S_2$ 
```

```
};
```

```
// P
```

```
if ( $\varphi$ ){  
  //  $\text{wp}[[S_1]](P)$   
   $S_1$   
}  
else {  
  //  $\text{wp}[[S_2]](P)$   
   $S_2$   
};  
//  $P$ 
```

```
//  $\varphi \wedge \text{wp}[[S_1]](P) \vee \neg\varphi \wedge \text{wp}[[S_2]](P)$   
if ( $\varphi$ ){  
  //  $\text{wp}[[S_1]](P)$   
   $S_1$   
}  
else {  
  //  $\text{wp}[[S_2]](P)$   
   $S_2$   
};  
// P
```

```
//  $[\varphi] \cdot \text{wp}[[S_1]](P) + [\neg\varphi] \cdot \text{wp}[[S_2]](P)$ 
```

```
//  $\varphi \wedge \text{wp}[[S_1]](P) \vee \neg\varphi \wedge \text{wp}[[S_2]](P)$ 
```

```
if ( $\varphi$ ){
```

```
  //  $\text{wp}[[S_1]](P)$ 
```

```
     $S_1$ 
```

```
}
```

```
else {
```

```
  //  $\text{wp}[[S_2]](P)$ 
```

```
     $S_2$ 
```

```
};
```

```
//  $P$ 
```

# Weakest Preconditions

program $S$	$\text{wp}[[S]](P)$	$\text{wp}[[S]](f)$
$x := E$	$P[x/E]$	$f[x/E]$
<b>if</b> $(\varphi)$ $\{ S_1 \}$ <b>else</b> $\{ S_2 \}$	$(\varphi \wedge \text{wp}[[S_1]](P)) \vee (\neg\varphi \wedge \text{wp}[[S_2]](P))$	$([\varphi]\text{wp}[[S_1]](f)) + ([\neg\varphi]\text{wp}[[S_2]](f))$
$S_1 \ ; \ S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](P))$	$\text{wp}[[S_1]](\text{wp}[[S_2]](f))$
<b>while</b> $(\varphi)$ $\{ S \}$	$\text{lfp } X. (\varphi \wedge \text{wp}[[S]](X)) \vee (\neg\varphi \wedge P)$	$\text{lfp } X. ([\varphi]\text{wp}[[S]](X)) + ([\neg\varphi]f)$
$S_1$ $[p]$ $S_2$	?	$p \cdot \text{wp}[[S_1]](f) + (1 - p) \cdot \text{wp}[[S_2]](f)$

## Open rocket\_landing\_bounded.heyvl

<https://rwth-aachen.sciebo.de/s/aKYC3EBGy7TPoPX>

```
caesar > ( rocket_landing_bounded.heyvl
✓ 1 coproc rocket(init_fuel: UInt, init_fuelPressure: UInt, init_realTemp: UInt, init_falseTemp: UInt) -> (fuel: UInt,
  engineTemp: UInt, fuelPressure: UInt, engineOn: Bool, realTemp: UInt, falseTemp: UInt)
  2   pre 0.95 * [init_realTemp <= 900 && 50<=init_fuel && init_fuelPressure > 450] + 0.05 * [init_falseTemp <= 900 &&
    3     50<=init_fuel && init_fuelPressure > 450]
    post [fuelPressure > 500 && engineOn == true && 50 <= fuel && fuel <= 100]
  4   {
  5     fuel = init_fuel
  6     realTemp = init_realTemp
  7     falseTemp = init_falseTemp
  8     fuelPressure = init_fuelPressure
  9
 10     var coin: Bool = flip(0.95)
 11     if coin {
 12       engineTemp = realTemp
 13     }
 14     else {
 15       engineTemp = falseTemp
 16     }
 17     @invariant([50<=fuel && fuelPressure > 450&& engineTemp <=900])
 18     while fuel > 100 {
 19       fuel = fuel-10
 20     }
 21     if engineTemp > 900 {
 22       engineOn = false
 23     } else {
 24       engineOn = true
 25     }
 26     fuelPressure = fuelPressure + 50
 27   }
```



# Program for Rocket Landing

```
// 0.95 [realTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel]
+ 0.05 [falseTemp ≤ 900 ∧ fuelPressure > 450 ∧ 50 ≤ fuel]
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp;
while (fuel > 100) {
    fuel := fuel - 10
};
if (engineTemp > 900){
    engineOn := False
}
else {
    engineOn := True
};
fuelPressure := fuelPressure + 50
```



```
// [fuelPressure > 500 ∧ engineOn = True ∧ 50 ≤ fuel ≤ 100]
```

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Expected value of  $f$  in  $\sigma$

# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

Expected value of  $f$  in  $\sigma$

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// engineTemp
```



# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

Expected value of  $f$  in  $\sigma$

```
// 0.95 · realTemp + 0.05 · falseTemp
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// engineTemp
```



# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

Expected value of  $f$  in  $\sigma$

```
// 0.95 · realTemp + 0.05 · falseTemp
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// engineTemp
```



$f = \text{engineTemp}$

# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

Expected value of  $f$  in  $\sigma$

```
// 0.95 · realTemp + 0.05 · falseTemp
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// engineTemp
```



$f = \text{engineTemp}$

$$f(\text{realTemp} = 1000, \text{falseTemp} = 800) = 0.95 \cdot 1000 + 0.05 \cdot 800 = 990$$

# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Expected value of  $f$  in  $\sigma$

```
// 0.95 · realTemp + 0.05 · falseTemp
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// engineTemp
```



$$f = \text{engineTemp}$$

$$f(\text{realTemp} = 1000, \text{falseTemp} = 800) = 0.95 \cdot 1000 + 0.05 \cdot 800 = 990$$

$$f(\text{realTemp} = 800, \text{falseTemp} = 1000) = 810$$

# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Expected value of  $f$  in  $\sigma$

```
// 0.95 · realTemp + 0.05 · falseTemp
```

```
engineTemp := realTemp [0.95] engineTemp := falseTemp
```

```
// engineTemp
```



$$f = \text{engineTemp}$$

$$f(\text{realTemp} = 1000, \text{falseTemp} = 800) = 0.95 \cdot 1000 + 0.05 \cdot 800 = 990$$

$$f(\text{realTemp} = 800, \text{falseTemp} = 1000) = 810$$

$$f(\text{realTemp} = 950, \text{falseTemp} = 1000) = 952.5$$

# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

Expected value of  $f$  in  $\sigma$

```
// 0.95 · 1.2 · engineTemp
```

```
engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
// engineTemp
```



# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

Expected value of  $f$  in  $\sigma$

```
// 1.14 · engineTemp
```

```
// 0.95 · 1.2 · engineTemp
```

```
engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
// engineTemp
```



# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Expected value of  $f$  in  $\sigma$

```
// 1.14 · engineTemp
```

```
// 0.95 · 1.2 · engineTemp
```

```
engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
// engineTemp
```



$$f = \text{engineTemp}$$

$$f(\text{engineTemp} = 1000) = 1.14 \cdot 1000 = 1140$$

# Unbounded Quantitative Predicates

## Predicate before:

$$P : \Sigma \rightarrow \{\text{true}, \text{false}\}$$

$$P(\sigma) = \text{true} \text{ iff } P(\llbracket S \rrbracket(\sigma)) = \text{true}$$

## Predicate now:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$

$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

← Expected value of  $f$  in  $\sigma$

```
// 1.14 · engineTemp
```

```
// 0.95 · 1.2 · engineTemp
```

```
engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
// engineTemp
```



$$f = \text{engineTemp}$$

$$f(\text{engineTemp} = 800) = 1.14 \cdot 800 = 912$$

$$f(\text{engineTemp} = 1000) = 1.14 \cdot 1000 = 1140$$

$$f(\text{engineTemp} = 950) = 1083$$

# Unbounded Quantitative Predicates

---

```
while (fuel > 100) {
```

```
    fuel := fuel - 10;
```

```
    engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
}
```

# Unbounded Quantitative Predicates

---

```
while (fuel > 100) {
```

```
    fuel := fuel - 10;
```

```
    engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
}
```

```
// engineTemp
```

# Unbounded Quantitative Predicates

---

```
while (fuel > 100) {
```

```
    fuel := fuel - 10;
```

```
    engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
// [fuel ≤ 100] · engineTemp + [fuel > 100] · 1.14⌈ $\frac{\text{fuel}-100}{10}$ ⌉} · engineTemp
```

```
}
```

```
// engineTemp
```

# Unbounded Quantitative Predicates

```
while (fuel > 100) {
```

```
    fuel := fuel - 10;
```

```
    // [fuel ≤ 100] · 1.14 · engineTemp  
    + [fuel > 100] · 1.14⌈ $\frac{\text{fuel} + 10 - 100}{10}$ ⌉ · engineTemp
```

```
    engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
    // [fuel ≤ 100] · engineTemp + [fuel > 100] · 1.14⌈ $\frac{\text{fuel} - 100}{10}$ ⌉ · engineTemp
```

```
}
```

```
// engineTemp
```

# Unbounded Quantitative Predicates

```
while (fuel > 100) {  
  // [fuel ≤ 110] · 1.14 · engineTemp  
  + [fuel > 110] · 1.14⌈ $\frac{\text{fuel}-100}{10}$ ⌉ · engineTemp  
  fuel := fuel - 10;  
  
  // [fuel ≤ 100] · 1.14 · engineTemp  
  + [fuel > 100] · 1.14⌈ $\frac{\text{fuel}+10-100}{10}$ ⌉ · engineTemp  
  engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0  
  
  // [fuel ≤ 100] · engineTemp + [fuel > 100] · 1.14⌈ $\frac{\text{fuel}-100}{10}$ ⌉ · engineTemp  
}  
  
// engineTemp
```

# Unbounded Quantitative Predicates

```
// [fuel ≤ 100] · engineTemp + [fuel > 100] · 1.14⌈ $\frac{\text{fuel}-100}{10}$ ⌉ · engineTemp
```

```
while (fuel > 100) {
```

```
// [fuel ≤ 110] · 1.14 · engineTemp  
+ [fuel > 110] · 1.14⌈ $\frac{\text{fuel}-100}{10}$ ⌉ · engineTemp
```

```
fuel := fuel - 10;
```

```
// [fuel ≤ 100] · 1.14 · engineTemp  
+ [fuel > 100] · 1.14⌈ $\frac{\text{fuel}+10-100}{10}$ ⌉ · engineTemp
```

```
engineTemp := 1.2 · engineTemp [0.95] engineTemp := 0
```

```
// [fuel ≤ 100] · engineTemp + [fuel > 100] · 1.14⌈ $\frac{\text{fuel}-100}{10}$ ⌉ · engineTemp
```

```
}
```

```
// engineTemp
```

# How to handle loops?

---

```
while ( $\varphi$ ) {  
    body  
}
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
}
```

# How to handle loops?

---

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
}
```

# How to handle loops?

---

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
}
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
}
```

```
// post
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
}
```

```
// post
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
// wp[while](post) = X
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
}
```

```
// post
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
// wp[while](post)
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
// wp[while](post) = X
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
}
```

```
// post
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
wp[while](post)  
= wp[if ( $\varphi$ ) {body; while}](post)
```

```
// wp[while](post)
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
// wp[while](post) = X
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
}
```

```
// post
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
wp[while](post)  
= wp[if ( $\varphi$ ) {body; while}](post)  
= [ $\varphi$ ] · wp[body](X) + [ $\neg\varphi$ ] · post,
```

```
// wp[while](post)
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
// wp[while](post) = X
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
}
```

```
// post
```

# How to handle loops?

```
// wp[while](post)
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

$$\begin{aligned} \text{wp}[\text{while}](\text{post}) &= \text{wp}[\text{if } (\varphi) \{ \text{body}; \text{while} \}](\text{post}) \\ &= [\varphi] \cdot \text{wp}[\text{body}](\mathbf{X}) + [\neg\varphi] \cdot \text{post}, \\ &= \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} \end{aligned}$$

```
// wp[while](post)
```

```
if ( $\varphi$ ) {  
    body;  
}
```

```
// wp[while](post) =  $\mathbf{X}$ 
```

```
while ( $\varphi$ ) {  
    body  
}
```

```
// post
```

```
}
```

```
// post
```

## Finding fixpoints is hard

---

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

- ▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)

# Finding fixpoints is hard

undecidable

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

- ▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)
- ▶ least element  $\perp = 0$  exists

# Finding fixpoints is hard

undecidable

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

- ▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)
- ▶ least element  $\perp = 0$  exists
- ▶ for every ascending  $\omega$ -chain  $p_0 \leq p_1 \leq \dots$   
the supremum  $\bigsqcup_{i \in \mathbb{N}} p_i \in \mathbb{R}_{\geq 0}^{\infty}$  exists

# Finding fixpoints is hard

undecidable

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

- ▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)
  - ▶ least element  $\perp = 0$  exists
  - ▶ for every ascending  $\omega$ -chain  $p_0 \leq p_1 \leq \dots$   
the supremum  $\bigsqcup_{i \in \mathbb{N}} p_i \in \mathbb{R}_{\geq 0}^{\infty}$  exists
- $\Rightarrow$  the set  $\mathbb{R}_{\geq 0}^{\infty}$  is  $\omega$ -complete partially ordered

# Finding fixpoints is hard

undecidable

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

- ▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)
  - ▶ least element  $\perp = 0$  exists
  - ▶ for every ascending  $\omega$ -chain  $p_0 \leq p_1 \leq \dots$   
the supremum  $\bigsqcup_{i \in \mathbb{N}} p_i \in \mathbb{R}_{\geq 0}^{\infty}$  exists
- $\Rightarrow$  the set  $\mathbb{R}_{\geq 0}^{\infty}$  is  $\omega$ -complete partially ordered
- $\Rightarrow$  transfers to set of expectations
- $$\{f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$$

# Finding fixpoints is hard

undecidable

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)

▶ least element  $\perp = 0$  exists

▶ for every ascending  $\omega$ -chain  $p_0 \leq p_1 \leq \dots$   
the supremum  $\bigsqcup_{i \in \mathbb{N}} p_i \in \mathbb{R}_{\geq 0}^{\infty}$  exists

$\Rightarrow$  the set  $\mathbb{R}_{\geq 0}^{\infty}$  is  $\omega$ -complete partially ordered

$\Rightarrow$  transfers to set of expectations

$$\{f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$$

▶ *monotone* since  $\forall X, Y : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$

$$X \leq Y \implies \Phi(X) \leq \Phi(Y)$$

# Finding fixpoints is hard

undecidable

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

▶  $\mathbb{R}_{\geq 0}^{\infty}$  is partially ordered (reflexive, transitive, antisymmetric)

▶ least element  $\perp = 0$  exists

▶ for every ascending  $\omega$ -chain  $p_0 \leq p_1 \leq \dots$   
the supremum  $\bigsqcup_{i \in \mathbb{N}} p_i \in \mathbb{R}_{\geq 0}^{\infty}$  exists

$\Rightarrow$  the set  $\mathbb{R}_{\geq 0}^{\infty}$  is  $\omega$ -complete partially ordered

$\Rightarrow$  transfers to set of expectations  
 $\{f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$

▶ *monotone* since  $\forall X, Y : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$

$$X \leq Y \implies \Phi(X) \leq \Phi(Y)$$

▶  $\omega$ -continuous since for every ascending  $\omega$ -chain  $X_0 \leq X_1 \leq \dots \subseteq \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$

$$\Phi\left(\bigsqcup_{n \in \mathbb{N}} X_n\right) = \bigsqcup_{n \in \mathbb{N}} \Phi(X_n)$$

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

## Kleene's Fixed Point Theorem

Set of expectations is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp).$$

## Finding fixpoints is hard

---

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
    i := i - 1;
```

```
    fuel := fuel + 10;
```

```
}
```

```
// fuel
```

## Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
    i := i - 1;
```

```
    fuel := fuel + 10;
```

```
    // X
```

```
}
```

```
// fuel
```

## Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

## Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) = & [i > 0] \cdot X [\text{fuel}/\text{fuel}+10, i/i-1] \\ & + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) &= [i > 0] \cdot X [\text{fuel}/\text{fuel}+10, i/i-1] \\ &\quad + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

$$\Phi_{\text{fuel}}(0) = [i > 0] \cdot 0 + [i = 0] \cdot \text{fuel}$$

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) &= [i > 0] \cdot X[\text{fuel}/\text{fuel}+10, i/i-1] \\ &\quad + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

$$\Phi_{\text{fuel}}(0) = [i > 0] \cdot 0 + [i = 0] \cdot \text{fuel}$$

$$\begin{aligned} \Phi_{\text{fuel}}^2(0) &= [i > 1] \cdot 0 + [i = 1] \cdot (\text{fuel} + 10) \\ &\quad + [i = 0] \cdot \text{fuel} \end{aligned}$$

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) &= [i > 0] \cdot X \text{ [fuel/fuel+10, i/i-1]} \\ &\quad + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

$$\Phi_{\text{fuel}}(0) = [i > 0] \cdot 0 + [i = 0] \cdot \text{fuel}$$

$$\begin{aligned} \Phi_{\text{fuel}}^2(0) &= [i > 1] \cdot 0 + [i = 1] \cdot (\text{fuel} + 10) \\ &\quad + [i = 0] \cdot \text{fuel} \end{aligned}$$

$$\begin{aligned} \Phi_{\text{fuel}}^3(0) &= [i > 2] \cdot 0 + [i = 2] \cdot (\text{fuel} + 20) \\ &\quad + [i = 1] \cdot (\text{fuel} + 10) + [i = 0] \cdot \text{fuel} \end{aligned}$$

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) &= [i > 0] \cdot X \text{ [fuel/fuel+10, i/i-1]} \\ &\quad + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

$$\Phi_{\text{fuel}}(0) = [i > 0] \cdot 0 + [i = 0] \cdot \text{fuel}$$

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$$\begin{aligned} \Phi_{\text{fuel}}^3(0) &= [i > 2] \cdot 0 + [i = 2] \cdot (\text{fuel} + 20) \\ &\quad + [i = 1] \cdot (\text{fuel} + 10) + [i = 0] \cdot \text{fuel} \end{aligned}$$

$$\Phi_{\text{fuel}}(0) \leq \Phi_{\text{fuel}}^2(0) \leq \Phi_{\text{fuel}}^3(0) \leq \dots$$

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
i := 20; fuel := 100;
```

```
// fuel + i · 10
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) &= [i > 0] \cdot X [\text{fuel}/\text{fuel}+10, i/i-1] \\ &\quad + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

$$\Phi_{\text{fuel}}(0) = [i > 0] \cdot 0 + [i = 0] \cdot \text{fuel}$$

$$\begin{aligned} \Phi_{\text{fuel}}^2(0) &= [i > 1] \cdot 0 + [i = 1] \cdot (\text{fuel} + 10) \\ &\quad + [i = 0] \cdot \text{fuel} \end{aligned}$$

$$\begin{aligned} \Phi_{\text{fuel}}^3(0) &= [i > 2] \cdot 0 + [i = 2] \cdot (\text{fuel} + 20) \\ &\quad + [i = 1] \cdot (\text{fuel} + 10) + [i = 0] \cdot \text{fuel} \end{aligned}$$

$$\Phi_{\text{fuel}}(0) \leq \Phi_{\text{fuel}}^2(0) \leq \Phi_{\text{fuel}}^3(0) \leq \dots$$

$$\bigsqcup_{n \in \mathbb{N}} \Phi_{\text{fuel}}^n(0) = \text{fuel} + i \cdot 10$$

# Finding fixpoints is hard

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X) = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp)$$

```
// 300
```

```
i := 20; fuel := 100;
```

```
// fuel + i · 10
```

```
while (i > 0) {
```

```
  // X[fuel/fuel+10, i/i-1]
```

```
  i := i - 1;
```

```
  fuel := fuel + 10;
```

```
  // X
```

```
}
```

```
// fuel
```

$$\begin{aligned} \Phi_{\text{fuel}}(X) &= [i > 0] \cdot X \text{ [fuel/fuel+10, i/i-1]} \\ &\quad + [i = 0] \cdot \text{fuel} \quad \perp = 0 : \sigma \mapsto 0 \end{aligned}$$

$$\Phi_{\text{fuel}}(0) = [i > 0] \cdot 0 + [i = 0] \cdot \text{fuel}$$

$$\begin{aligned} \Phi_{\text{fuel}}^2(0) &= [i > 1] \cdot 0 + [i = 1] \cdot (\text{fuel} + 10) \\ &\quad + [i = 0] \cdot \text{fuel} \end{aligned}$$

$$\begin{aligned} \Phi_{\text{fuel}}^3(0) &= [i > 2] \cdot 0 + [i = 2] \cdot (\text{fuel} + 20) \\ &\quad + [i = 1] \cdot (\text{fuel} + 10) + [i = 0] \cdot \text{fuel} \end{aligned}$$

$$\Phi_{\text{fuel}}(0) \leq \Phi_{\text{fuel}}^2(0) \leq \Phi_{\text{fuel}}^3(0) \leq \dots$$

$$\bigsqcup_{n \in \mathbb{N}} \Phi_{\text{fuel}}^n(0) = \text{fuel} + i \cdot 10$$

## Proving upper bounds is easier

---

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

## Proving upper bounds is easier

---

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

### Park Induction

Set of expectations is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\Phi_{\text{post}}(I) \leq I \implies \text{wp}[\text{while}](\text{post}) \leq I.$$

# Proving upper bounds is easier

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

## Park Induction

Set of expectations is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\Phi_{\text{post}}(I) \leq I \implies \text{wp}[\text{while}](\text{post}) \leq I.$$

$$\Phi_{\text{fuel}}(X) = [i > 0] \cdot X [\text{fuel}/\text{fuel}+10, i/i-1] + [i = 0] \cdot \text{fuel}$$

Show that  $\text{wp}[\text{while}](\text{post}) \leq 2 \cdot \text{fuel} + 30 \cdot i$  :

# Proving upper bounds is easier

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

## Park Induction

Set of expectations is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\Phi_{\text{post}}(I) \leq I \implies \text{wp}[\text{while}](\text{post}) \leq I.$$

$$\Phi_{\text{fuel}}(X) = [i > 0] \cdot X [\text{fuel}/\text{fuel}+10, i/i-1] + [i = 0] \cdot \text{fuel}$$

Show that  $\text{wp}[\text{while}](\text{post}) \leq 2 \cdot \text{fuel} + 30 \cdot i$ :

$$\Phi_{\text{fuel}}(2 \cdot \text{fuel} + 30 \cdot i) = [i > 0] \cdot (2 \cdot \text{fuel} + 25 \cdot i - 10) + [i = 0] \cdot \text{fuel} \leq 2 \cdot \text{fuel} + 30 \cdot i$$



# Proving upper bounds is easier

$$\text{wp}[\text{while}](\text{post}) = \text{lfp } X. [\varphi] \cdot \text{wp}[\text{body}](X) + [\neg\varphi] \cdot \text{post} = \text{lfp } X. \Phi_{\text{post}}(X)$$

Reminder:  $X, Y \in \{\Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}\}$  are expectations

## Park Induction

Set of expectations is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\Phi_{\text{post}}(I) \leq I \implies \text{wp}[\text{while}](\text{post}) \leq I.$$

- ▶ there exist many more proof rules like  $\kappa$ -induction,  $\omega$ -induction, guard strengthening, ...
- ▶ some consider upper bounds, others refute lower bounds

## Open rocket\_landing\_bounded.heyvl

<https://rwth-aachen.sciebo.de/s/aKYC3EBGy7TPoPX>

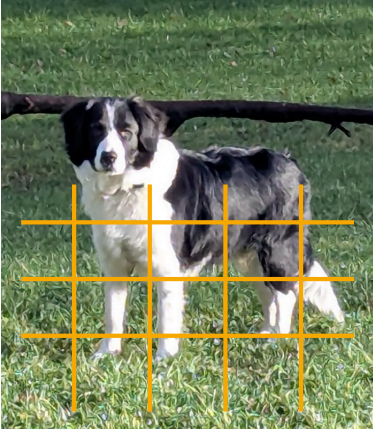
```
caesar > ( rocket_landing_bounded.heyvl
✓ 1 coproc rocket(init_fuel: UInt, init_fuelPressure: UInt, init_realTemp: UInt, init_falseTemp: UInt) -> (fuel: UInt,
   engineTemp: UInt, fuelPressure: UInt, engineOn: Bool, realTemp: UInt, falseTemp: UInt)
2   pre 0.95 * [init_realTemp <= 900 && 50<=init_fuel && init_fuelPressure > 450] + 0.05 * [init_falseTemp <= 900 &&
   50<=init_fuel && init_fuelPressure > 450]
3   post [fuelPressure > 500 && engineOn == true && 50 <= fuel && fuel <= 100]
4   {
5     fuel = init_fuel
6     realTemp = init_realTemp
7     falseTemp = init_falseTemp
8     fuelPressure = init_fuelPressure
9
10    var coin: Bool = flip(0.95)
11    if coin {
12      engineTemp = realTemp
13    }
14    else {
15      engineTemp = falseTemp
16    }
17    @invariant([50<=fuel && fuelPressure > 450&& engineTemp <=900])
18    while fuel > 100 {
19      fuel = fuel-10
20    }
21    if engineTemp > 900 {
22      engineOn = false
23    } else {
24      engineOn = true
25    }
26    fuelPressure = fuelPressure + 50
27  }
```



Break until 16:45?

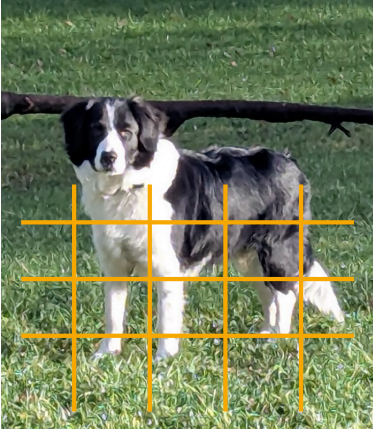
## Short-Sighted Cow\*

\*Dog

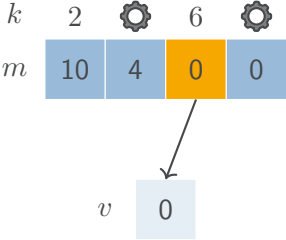


## Short-Sighted Cow\*

\*Dog

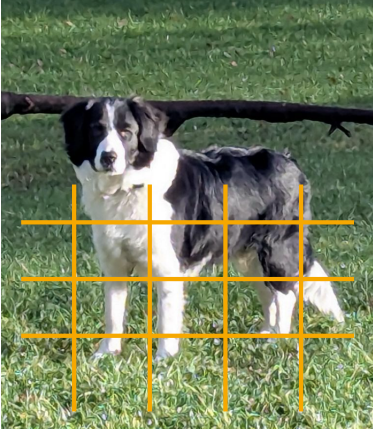


## Lock-Freedom

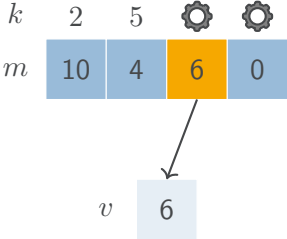


## Short-Sighted Cow\*

\*Dog



## Lock-Freedom

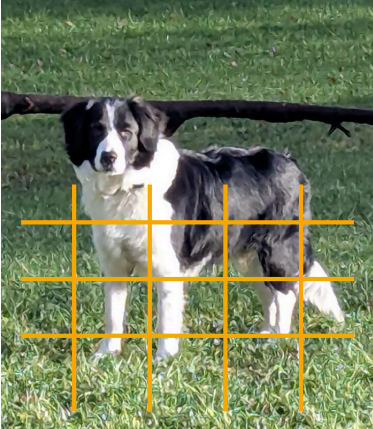


## Ski-Rental Problem

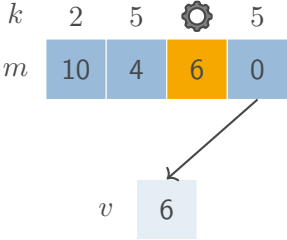


## Short-Sighted Cow\*

\*Dog



## Lock-Freedom

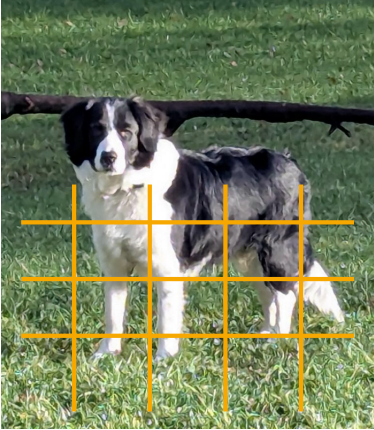


## Ski-Rental Problem

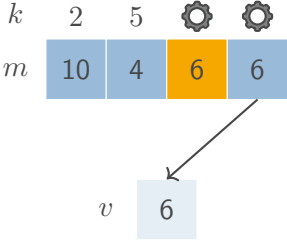


## Short-Sighted Cow\*

\*Dog



## Lock-Freedom

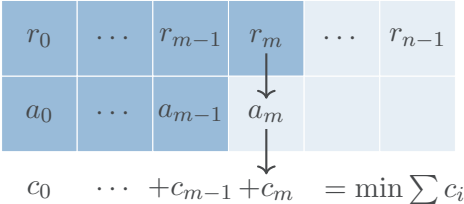


## Ski-Rental Problem



*An online algorithm is one that receives a sequence of requests and, performs an immediate action in response to each request. Each sequence of requests and corresponding actions has an associated cost.*

*Richard M. Karp, 1992*



# Ski-Rental Problem

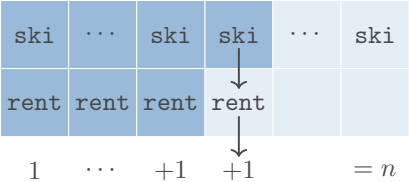
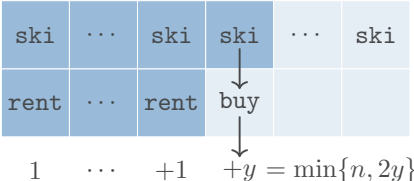
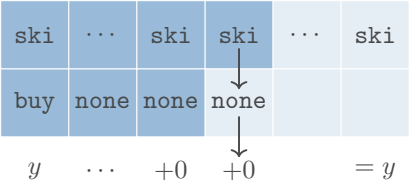
ski	...	ski	ski	...	ski
buy	none	none	none		
$y$	...	+0	+0		= $y$

# Ski-Rental Problem

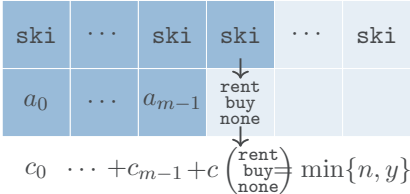
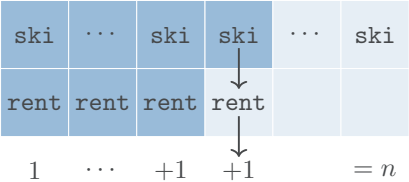
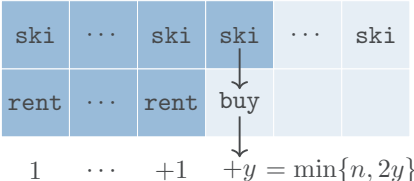
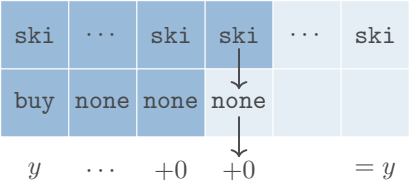
ski	...	ski	ski	...	ski
buy	none	none	none		
$y$	...	+0	+0		= $y$

ski	...	ski	ski	...	ski
rent	rent	rent	rent		
1	...	+1	+1		= $n$

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## Optimization Problem

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Off = while  $(m < n)$  {

$m := m + 1$ }

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```
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Monoid-Module  $\mathcal{W}$

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# Unbounded Quantitative Predicates

## Predicate before:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$
$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

## Predicate now:

$$w : \Sigma \rightarrow \mathcal{W}$$
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$$C \rightarrow x := E \quad | \quad C_1 ; C_2 \quad | \quad \otimes v$$
$$| \quad \text{if } (\varphi) \{ C_1 \} \text{ else } \{ C_2 \} \quad | \quad \text{while } (\varphi) \{ C_1 \} \quad | \quad \{ C_1 \} \oplus \{ C_2 \},$$

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$$| \quad \text{if } (\varphi) \{ C_1 \} \text{ else } \{ C_2 \} \quad | \quad \text{while } (\varphi) \{ C_1 \} \quad | \quad \{ C_1 \} \oplus \{ C_2 \},$$

$$\otimes 1 ; s := 1$$

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# Unbounded Quantitative Predicates

## Predicate before:

$$f : \Sigma \rightarrow \mathbb{R}_{\geq 0}^{\infty}$$
$$f(\sigma) = f(\llbracket S \rrbracket(\sigma))$$

## Predicate now:

$$w : \Sigma \rightarrow \mathcal{W}$$
$$w(\sigma) = w(\llbracket S \rrbracket(\sigma))$$

Weighting via  $w$  in  $\sigma$

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$$\otimes ([s = 1] \cdot 0 \oplus [s = 0] \cdot \infty)$$
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# Weakest Preweightings

program $S$	$\text{wp}[[S]](f)$	program $S$	$\text{wp}[[S]](w)$
$x := E$	$f[x/E]$	$x := E$	$w[x/E]$
$\text{if } (\varphi) \{ S_1 \}$ $\text{else } \{ S_2 \}$	$[\varphi]\text{wp}[[S_1]](f)$ $+ [\neg\varphi]\text{wp}[[S_2]](f)$	$\otimes v$ $\text{if } (\varphi) \{ S_1 \}$ $\text{else } \{ S_2 \}$	$\otimes v$ $[\varphi]\text{wp}[[S_1]](w)$ $\oplus [\neg\varphi]\text{wp}[[S_2]](w)$
$S_1 \ ; \ S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](f))$	$S_1 \ ; \ S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](f))$
$\text{while } (\varphi) \{ S \}$	$\text{lfp } X. [\varphi]\text{wp}[[S]](X) + [\neg\varphi]f$	$\text{while } (\varphi) \{ S \}$	$\text{lfp } X. [\varphi]\text{wp}[[S]](X) \oplus [\neg\varphi]w$
$S_1 [p] S_2$	$p \cdot \text{wp}[[S_1]](f) + (1 - p) \cdot \text{wp}[[S_2]](f)$	$\{ S_1 \} \oplus \{ S_2 \}$	$\text{wp}[[S_1]](w) \oplus \text{wp}[[S_2]](w)$

# Weakest Preweightings Semantics

---

Consider tropical semiring  $\mathbb{S}_{\text{trop}} = (\mathbb{N}^{\infty}, \min, +, \infty, 0)$ :

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- ▶ semi-automatic verification tools (like Caesar) exist for some instances of weighted programming

# Lets Talk About Loops

$$\text{wp}[\text{while } (\varphi) \{S\}](w) = \text{lfp } X. [\varphi] \cdot \text{wp}[S](X) \oplus [\neg\varphi] \cdot w$$

## Kleene's Fixed Point Theorem

Set of *weightings* is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\text{lfp } \Phi_{\text{post}} = \bigsqcup_{n \in \mathbb{N}} \Phi_{\text{post}}^n(\perp).$$

## Park Induction

Set of *weightings* is  $\omega$ -complete partially ordered and  $\Phi_{\text{post}}$  is  $\omega$ -continuous implies

$$\Phi_{\text{post}}(I) \leq I \implies \text{lfp } \Phi_{\text{post}} \leq I.$$

# Weakest Prewightings of Translations

$$\begin{aligned} \text{Off} = & \text{while } (m < n) \{ \\ & \text{if } (\text{true}) \rightarrow \{ \odot 1 \ ; \ \text{skip} \} \\ & \oplus (\text{true}) \rightarrow \{ \odot y \ ; \ s := 1 \} \\ & \oplus (\text{true}) \rightarrow \{ \odot [s = 1] \cdot 0 \oplus [s = 0] \cdot \infty \} \\ & m := m + 1 \\ & \}. \end{aligned}$$
$$\begin{aligned} \text{On} = & \text{while } (m < n) \{ \\ & \text{if } (c < y) \rightarrow \{ \odot 1 \ ; \ \text{skip} \ ; \ c := c + 1 \} \\ & \oplus (c = y) \rightarrow \{ \odot y \ ; \ s := 1 \ ; \ c := c + 1 \} \\ & \oplus (c > y) \rightarrow \{ \odot [s = 1] \cdot 0 \oplus [s = 0] \cdot \infty \} \\ & m := m + 1 \\ & \}. \end{aligned}$$

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$$D = \sup_{R \in \mathcal{R}^n} \frac{\sigma_R(n \oplus 2y)}{\sigma_R(n \oplus y)} = \sup_{n > 0, y > 1} \frac{\min\{n, 2y\}}{\min\{n, y\}} = 2$$

# Using Weakest Preweightings for Competitive Ratio

---

Online Optimization:

- ▶ for each optimization problem manual proofs by hand

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problem-specific proofs by hand



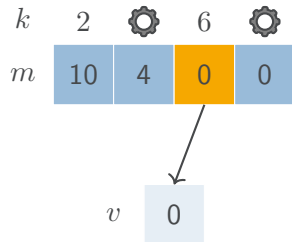
$$D := \sup_{R \in \mathcal{R}^n} \frac{c(\text{On}(R))}{c(\text{Off}(R))} = \sup_{R \in \mathcal{R}^n} \frac{\text{wp}[\text{On}](0)(\sigma_R)}{\text{wp}[\text{Off}](0)(\sigma_R)}$$



framework for semi-automatic verification

```

while (true) {
   $\bigoplus_{j=1}^N \{ i := j \};$ 
  if ( $m[i] = v$ ) {
     $\otimes S; v := k; m[i] := v;$ 
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## Formal Languages Module

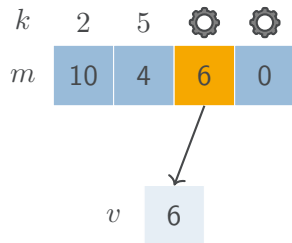
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$S$  is success,  $F$  is failure.

The algorithm is *lock-free* if there is always progress. No progress is  $F^\omega = FFF \dots$ .

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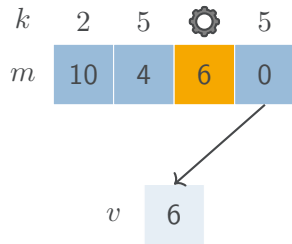
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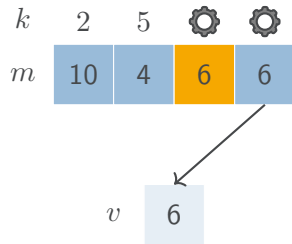
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$$\Phi_{\{\epsilon\}}(X) = \bigoplus_{j=1}^N ([m[i] = v] \cdot S \otimes X[m[i]/v, v/k] \oplus [m[i] \neq v] \cdot F \otimes X[m[i]/v])$$

$$\Phi_{\{\epsilon\}}(\Gamma^\omega) = \bigoplus_{j=1}^N ([m[i] = v] \cdot \Gamma^\omega \oplus [m[i] \neq v] \cdot \Gamma^\omega)$$

$$\Phi_{\{\epsilon\}}^2(\Gamma^\omega) = \bigoplus_{j=1}^N ([m[i] = v] \cdot \Gamma^\omega \oplus [m[i] \neq v] \cdot \Gamma^\omega)$$

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Measurement

Entanglement

Schrödinger's Cat

# Quantum Computing

Superposition

Qubit

Quantum state

Bloch sphere

Circuit

**Bit:**

classical computer

value: 0 or 1

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value: 0 or 1

**Qubit:**

quantum computer

value:  $|0\rangle$  or  $|1\rangle$  or mixture of them

normalized vector in  $C^2$

# Qubit

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classical computer

value: 0 or 1

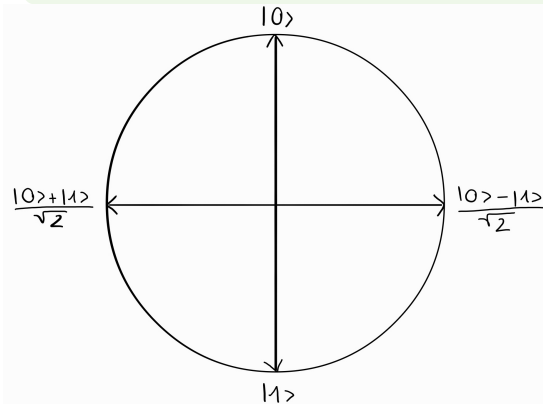
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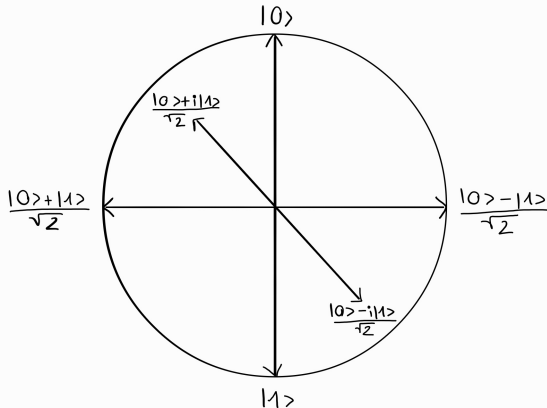
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general:  $|\psi\rangle = \begin{pmatrix} \alpha \\ \beta \end{pmatrix}$  with  $\alpha, \beta \in \mathbb{C}$  such that

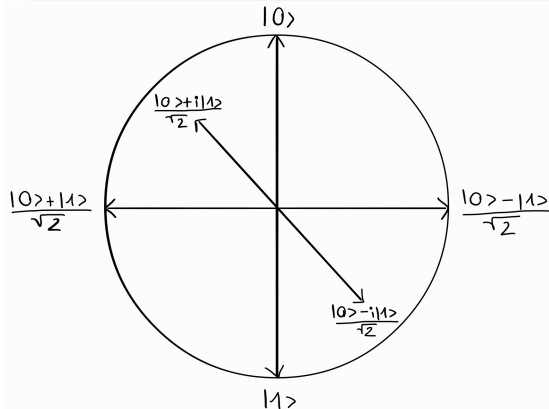
$$|\alpha|^2 + |\beta|^2 = 1$$

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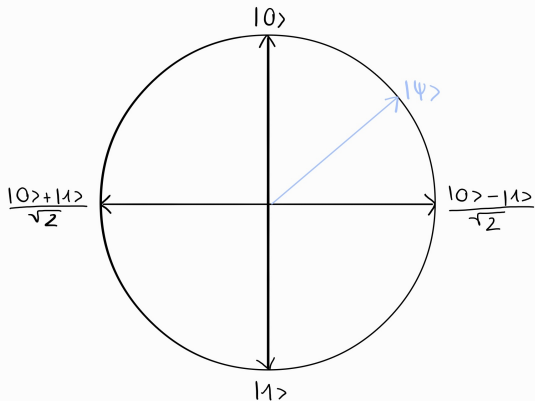
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# Measurements

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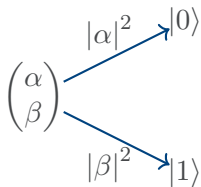
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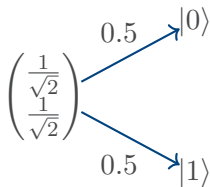
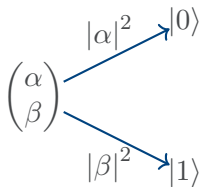
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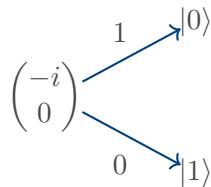
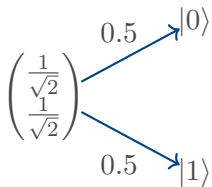
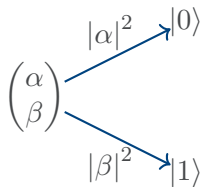
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## Solution: Measurements

- ▶ qubit changes to  $|0\rangle$  with probability  $|\alpha|^2$
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Note: destroys previous state, states cannot be copied



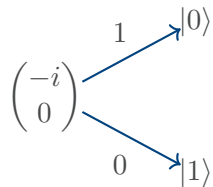
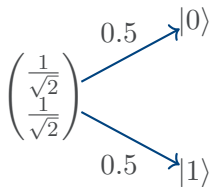
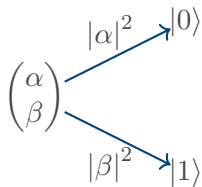
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**Schrödinger's Cat:** A cat in a box is alive and dead at the same time and as soon as we open the box and look inside, it is either alive or dead ( $\approx$  measurement)

# Unitaries

---

How can we change states?

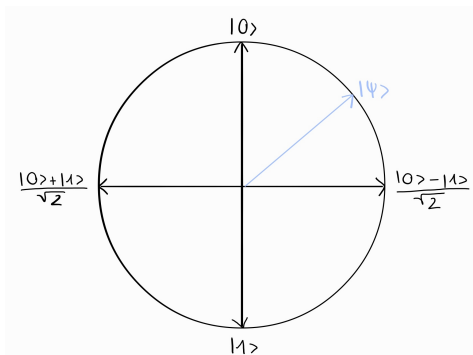
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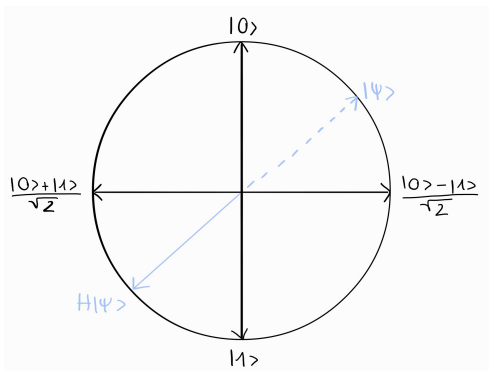


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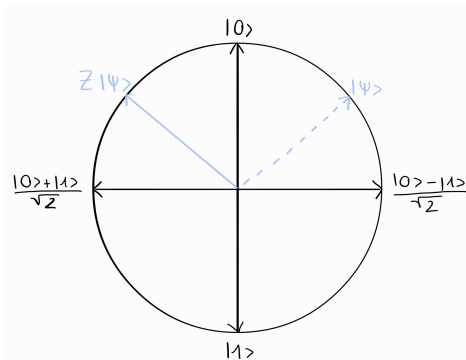


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$$H = \begin{pmatrix} \frac{1}{\sqrt{2}} & \frac{1}{\sqrt{2}} \\ \frac{1}{\sqrt{2}} & -\frac{1}{\sqrt{2}} \end{pmatrix}, Z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}, \dots$$



# Multiple Qubits

---

Combine vectors using tensor product to describe state of bigger system:  $\begin{pmatrix} a \\ b \end{pmatrix} \otimes \begin{pmatrix} c \\ d \end{pmatrix} = \begin{pmatrix} ac \\ ad \\ bc \\ bd \end{pmatrix}$

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Intuition:  $CNOT |xy\rangle = |x, y \oplus x\rangle$  for  $x, y \in \{0, 1\}$ , i.e. toggle second qubit if first one is  $|1\rangle$

Definition: Two qubits in state  $\begin{pmatrix} \alpha \\ \beta \\ \gamma \\ \delta \end{pmatrix}$  that cannot be written in form  $\begin{pmatrix} a \\ b \end{pmatrix} \otimes \begin{pmatrix} c \\ d \end{pmatrix}$ .

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# Entanglement

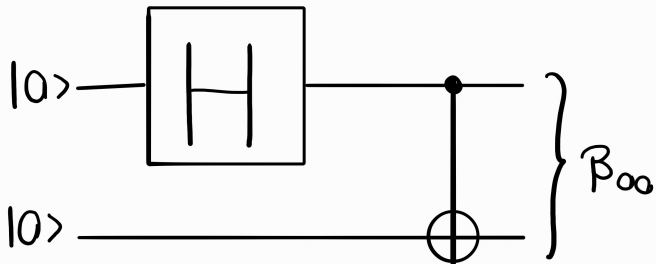
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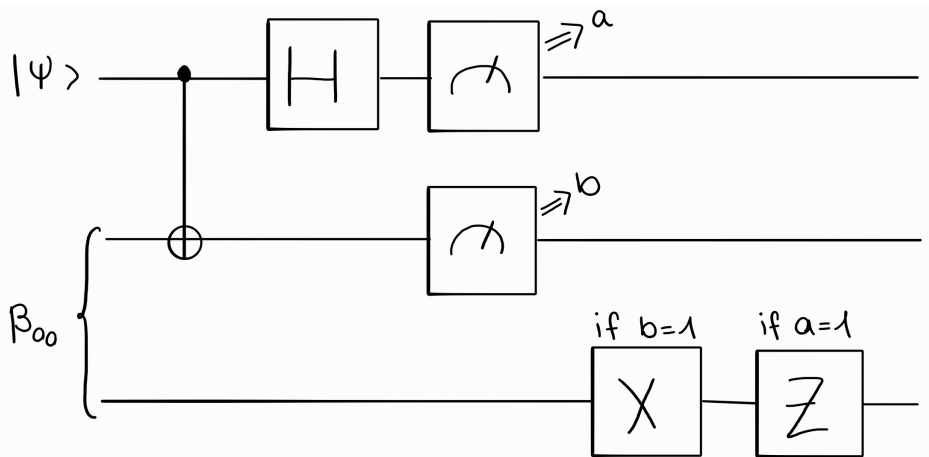
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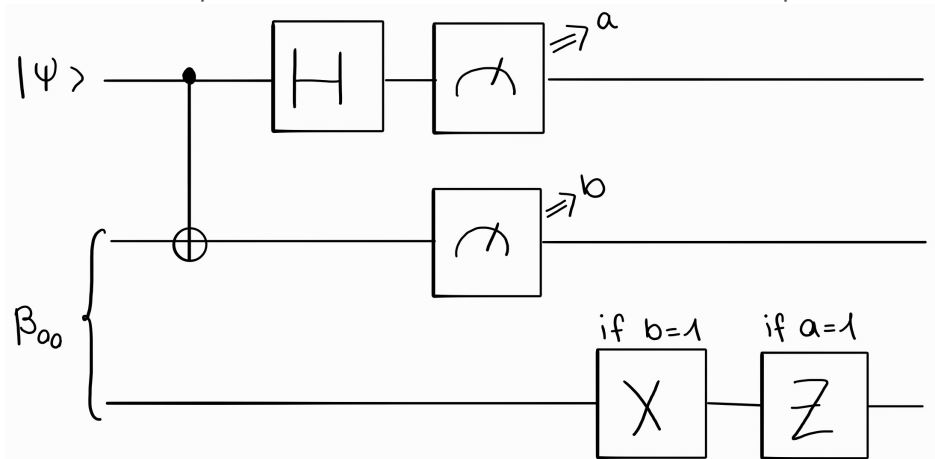
# Teleportation Circuit

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# Teleportation Circuit

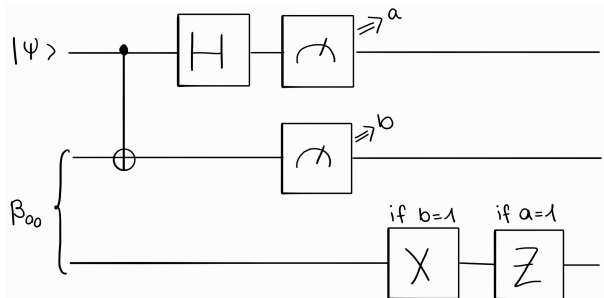
But we are computer scientists and want to use if-branches, loops, ...



not a nice way to enter this into a computer, we want a programming language

# Teleportation Program

```
q1q2 := CNOT(q1q2);  
q1 := Hq1;  
if (measure q2 = 1){  
  q3 := Xq3  
}  
else {  
  skip  
};  
if (measure q1 = 1){  
  q3 := Zq3  
}  
else {  
  skip  
}
```



program  $S$

---

skip

$q := |0\rangle$

$q := Uq$

if (measure  $q$ ) {  $S_1$  } else {  $S_2$  }

$S_1 ; S_2$

while (measure  $q$ ) {  $S$  }

skip

init

apply unitary

measurement with branching

concatenation

while loop with induced measurement

WP similar to probabilistic case [DP06, Yin12]

- ▶ Predicate: 1- bounded observable (special kind of matrix)
- ▶ Expected value:  $\langle \psi | P | \psi \rangle \in [0, 1]$  where  $\langle \psi | = \overline{|\psi\rangle}^T$   
"The probability that  $P$  holds in state  $|\psi\rangle$ "

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Example:  $P = |0\rangle \langle 0| = \begin{pmatrix} 1 & 0 \\ 0 & 0 \end{pmatrix}$  means "the qubit has value  $|0\rangle$ "

- ▶ state  $|0\rangle$ :  $\langle 0 | P | 0 \rangle = 1$
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- ▶ state  $|+\rangle$ :  $\langle + | P | + \rangle = 0.5$

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With  $P = \mathbf{0} = \begin{pmatrix} 0 & 0 \\ 0 & 0 \end{pmatrix}$  is  $\langle \psi | P | \psi \rangle = 0$  for all states  $|\psi\rangle$ .

program $S$	$\text{wp}[[S]](P)$
skip	$P$
$q :=  0\rangle$	$ 0\rangle \langle 0  P  0\rangle \langle 0  +  1\rangle \langle 0  P  0\rangle \langle 1 $
$q := Uq$	$U^\dagger P U$
if (measure $q$ ) { $S_1$ } else { $S_2$ }	$ 0\rangle \langle 0  \text{wp}[[S_1]](P)  0\rangle \langle 0  +  1\rangle \langle 1  \text{wp}[[S_2]](P)  1\rangle \langle 1 $
$S_1 \ ; \ S_2$	$\text{wp}[[S_1]](\text{wp}[[S_2]](P))$
while (measure $q$ ) { $S$ }	$\bigvee_{n=0}^{\infty} P_n$ with $P_0 = \mathbf{0}$ $P_{n+1} =  0\rangle \langle 0  P  0\rangle \langle 0  +  1\rangle \langle 1  \text{wp}[[S]](P_n)  1\rangle \langle 1 $

```


 $q_2 := |0\rangle;$ 
 $q_3 := |0\rangle;$ 
 $q_2 := Hq_2;$ 
 $q_2q_3 := CNOT(q_2q_3);$ 
 $q_1q_2 := CNOT(q_1q_2);$ 
 $q_1 := Hq_1;$ 
if (measure  $q_2 = 1$ ) {
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}

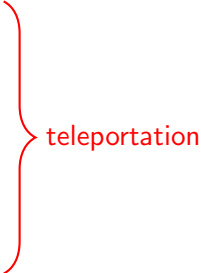
```

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q2 := |0>;
q3 := |0>;
q2 := Hq2;
q2q3 := CNOT(q2q3);
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```
// | ⊗ | ⊗ |ψ⟩⟨ψ|
```

```
//  $|\psi\rangle\langle\psi| \otimes I \otimes I$ 
```

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teleportation

```
//  $I \otimes I \otimes |\psi\rangle\langle\psi|$ 
```

Extensions:

- ▶ Weakest **liberal** preconditions (to include non-terminating runs) [Yin12]
- ▶ Classical variables [FY21]
- ▶ Conditioning [GUK25]
- ▶ ...

Work in progress:

- ▶ Translate quantum programs to probabilistic programs to use existing tools for automated verification (especially Caesar)
- ▶ Extend observables to unbounded operators, i.e. move from predicates to expectations as done in the probabilistic case

Thanks! Any questions?

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