

A Weakest Pre-Expectation Semantics for Mixed-Sign Expectations

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Example of a Probabilistic Program

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Formal verification of probabilistic programs!

Classical Weakest Pre-Expectations

The Non-Negative Case

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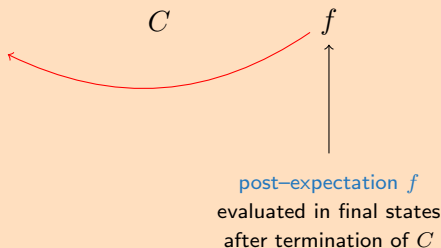


post-expectation f
evaluated in final states
after termination of C

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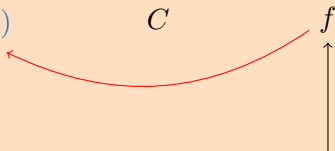
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$$\lambda \sigma. \text{EV}_{\llbracket C \rrbracket \sigma}(f) \stackrel{!}{=} \text{wp}[C](f)$$

 C
 f

weakest pre-expectation
of C with respect to f
evaluated in initial states
before executing C

post-expectation f
evaluated in final states
after termination of C

Weakest Pre-Expectation Reasoning

Example of wp Reasoning

$\{c := 0\} [1/2] \{c := 1\};$

if $(c = 1)$ **{** $x := 1$ **}** **else** $\{x := 2x + 1\};$

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`wp [skip] (x)`

`skip`

x

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{c := 0} [1/2] {c := 1};  
    [[c = 1]] · 1 + [[c = 0]] · (2x + 1)  
if (c = 1) {x := 1} else {x := 2x + 1};  
    x  
skip  
    x
```


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$\{c := 0\} [1/2] \{c := 1\};$

$1 + \llbracket c = 0 \rrbracket \cdot 2x$

if $(c = 1) \{x := 1\}$ **else** $\{x := 2x + 1\};$

x

skip

x

Weakest Pre-Expectation Reasoning

Example of wp Reasoning

$\text{wp} [\{\dots\} [1/2] \{\dots\}] (1 + \llbracket c = 0 \rrbracket \cdot 2x)$

$\{c := 0\} [1/2] \{c := 1\};$

$1 + \llbracket c = 0 \rrbracket \cdot 2x$

if $(c = 1)$ $\{x := 1\}$ **else** $\{x := 2x + 1\};$

x

skip

x

Weakest Pre-Expectation Reasoning

Example of wp Reasoning

$$\frac{1}{2} \cdot (1 + \llbracket 0 = 0 \rrbracket \cdot 2x) + \frac{1}{2} \cdot (1 + \llbracket 1 = 0 \rrbracket \cdot 2x)$$

$\{c := 0\} [1/2] \{c := 1\};$
 $1 + \llbracket c = 0 \rrbracket \cdot 2x$
if $(c = 1)$ **{** $x := 1$ **}** **else** **{** $x := 2x + 1$ **}**;
 x
skip
 x

Weakest Pre-Expectation Reasoning

Example of wp Reasoning

$1 + x$

$\{c := 0\} [1/2] \{c := 1\};$

$1 + \llbracket c = 0 \rrbracket \cdot 2x$

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x

skip

x

The wp Transformer for While Loops

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Complete partial order on expectations:

$$f_1 \preceq f_2 \quad \text{iff} \quad \forall \sigma: f_1(\sigma) \leq f_2(\sigma)$$

The Motivation

Example of wp Reasoning

```
     $1 + x$   
if (1/2) {c := 0} else {c := 1};  
     $1 + \llbracket c = 0 \rrbracket \cdot 2x$   
if (c = 1) {x := 1} else {x := 2x + 1};  
     $x$   
skip  
     $x$ 
```

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Example of wp Reasoning

$$1 + x \notin \mathbb{E}$$

if (1/2) {c := 0} else {c := 1};

$$1 + \llbracket c = 0 \rrbracket \cdot 2x \notin \mathbb{E}$$

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$$x \notin \mathbb{E}$$

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Example of wp Reasoning

```

 $1 + x \notin \mathbb{E}$ 
if (1/2) {c := 0} else {c := 1};
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if (c = 1) {x := 1} else {x := 2x + 1};
 $x \notin \mathbb{E}$ 
skip
 $x \notin \mathbb{E}$ 

```

Neither post-expectation x nor any of the pre-expectations are proper expectations!

Mixed-Sign Weakest Pre-Expectations

The Non-Non-Negative Case

Our Solution: Integrability-Witnessing Expectations

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- Integrability-witnessing pairs:

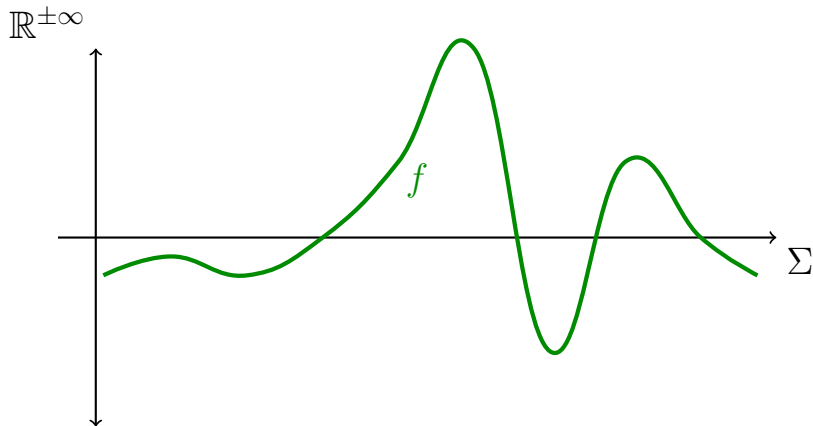
$$(f, g)$$

such that $f \in \mathbb{E}^*$, $g \in \mathbb{E}$, and $|f| \leq g$

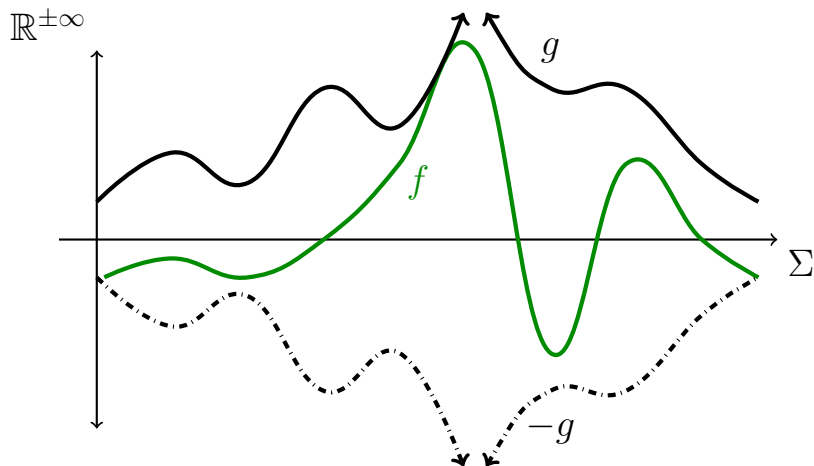
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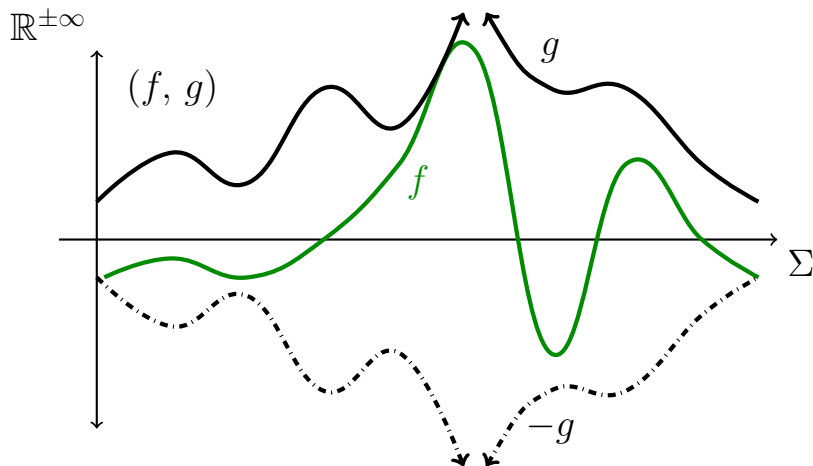
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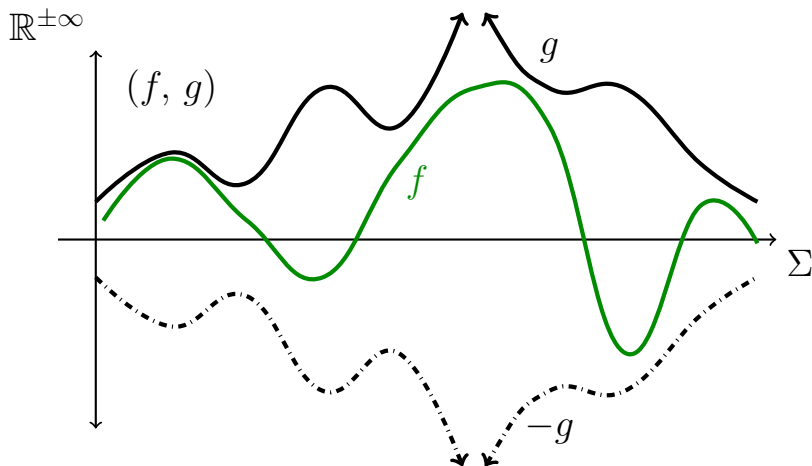
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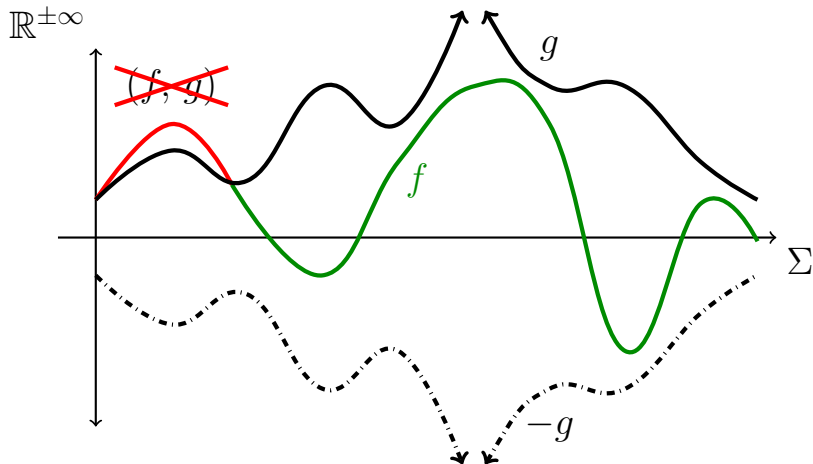
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wp with Integrability-Witnessing Pairs

Example of Integrability-Witnessing Pair Reasoning

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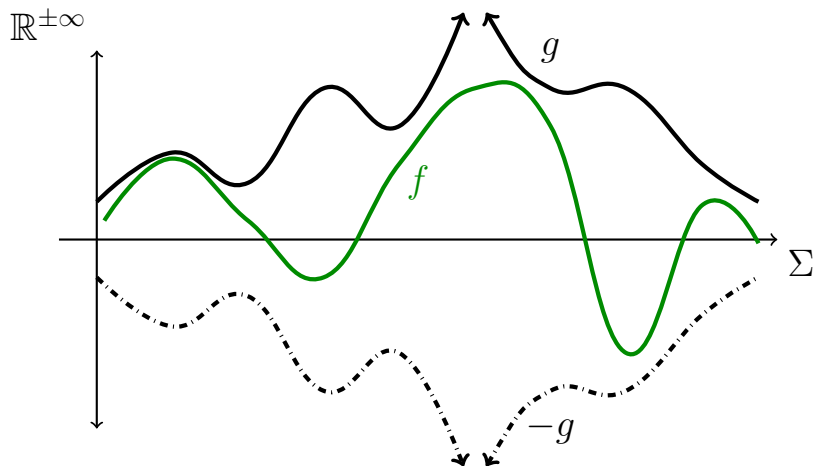
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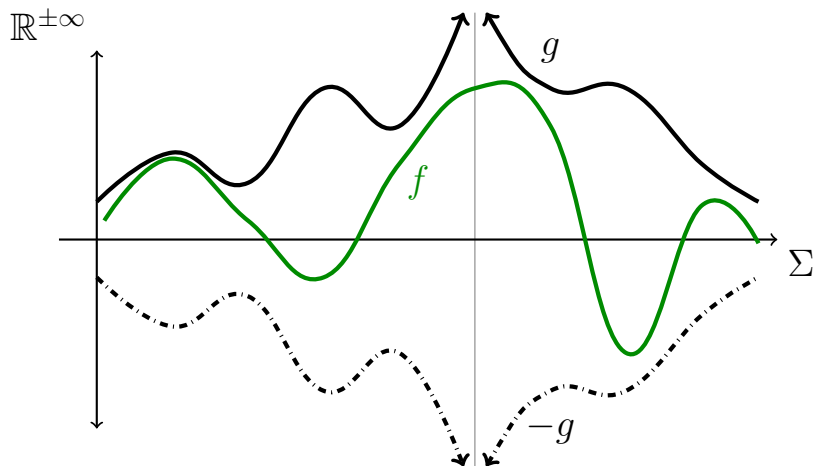
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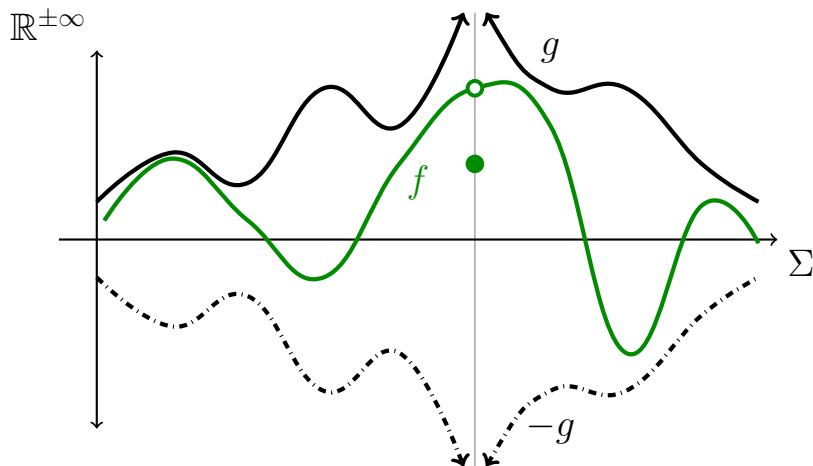
Our Solution: Integrability-Witnessing Expectations



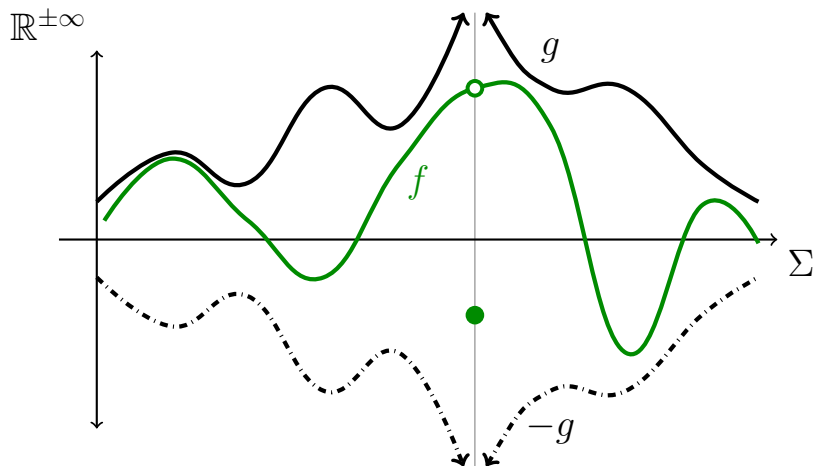
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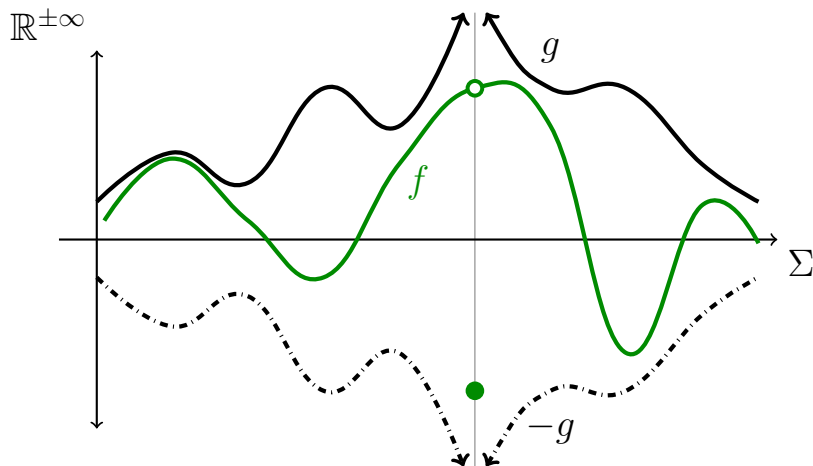
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- Still we can define a **wp transformer acting on IWEs**

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Thank you for your kind attention!

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Let $I \in \mathbb{E}$.

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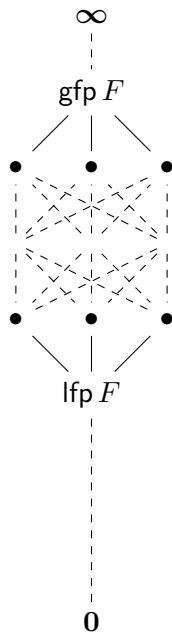
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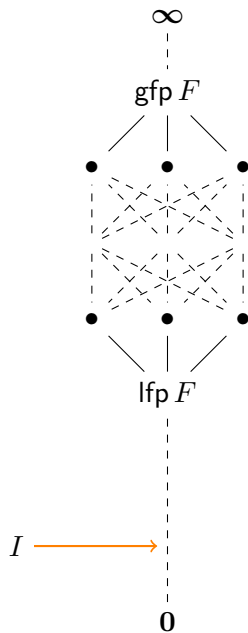
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$$\begin{aligned} I_0 \leq F_f(0) \quad \text{and} \quad I_{n+1} \leq F_f(I_n) \\ \text{implies} \quad \sup_{n \in \mathbb{N}} I_n \leq \text{wp}[\text{while } (\xi) \{C\}](f) . \end{aligned}$$

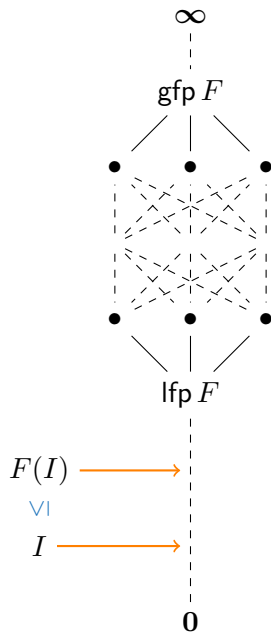
Backup Slides: Park's Lemma



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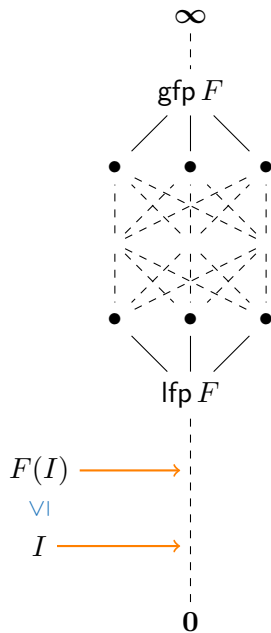


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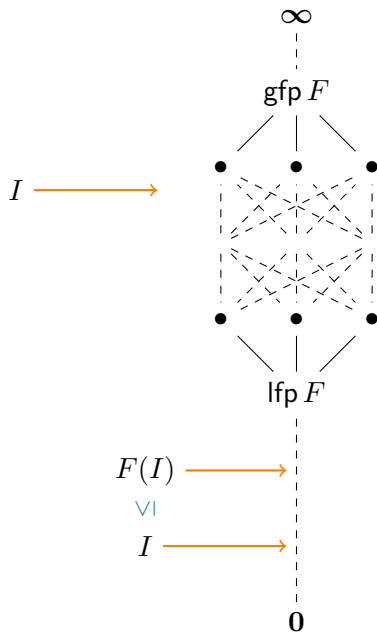
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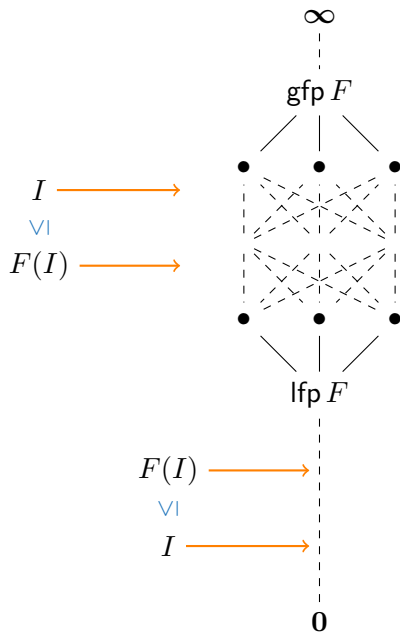
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PPDL's While Rule [Kozen '85, p. 168]

$\neg B \cdot f + B \cdot \langle C \rangle I \preceq I$ implies $\langle \text{while}(B) \{C\} \rangle f \preceq I$,
for $f \succeq 0$.