

# Stability: an Abstract Domain for the Trend of Variation of Variables

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# Abstract domains for numeric values

Sign  
Parity  
Constants

```
1 x = input()  
2  
3 if (x > 10)  
4  
5   y = 1 / x
```

precision



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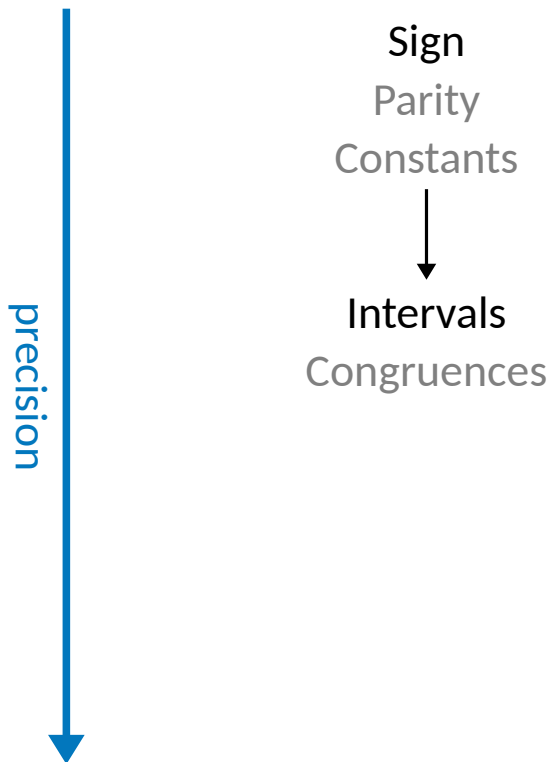
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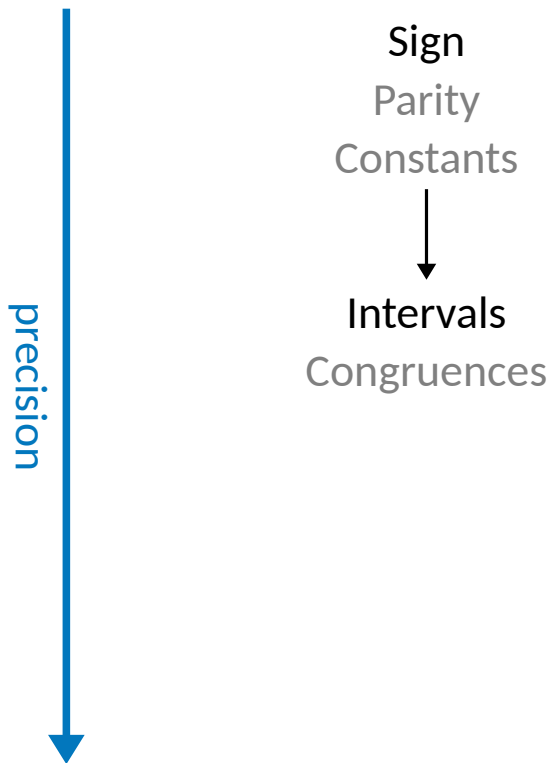


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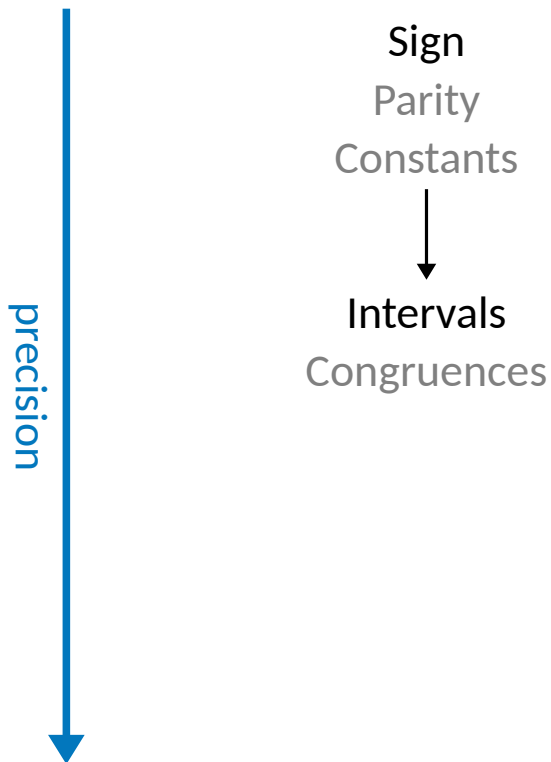


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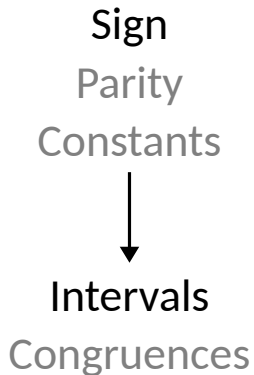
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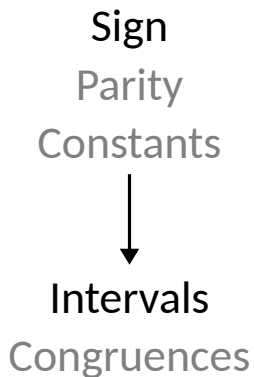
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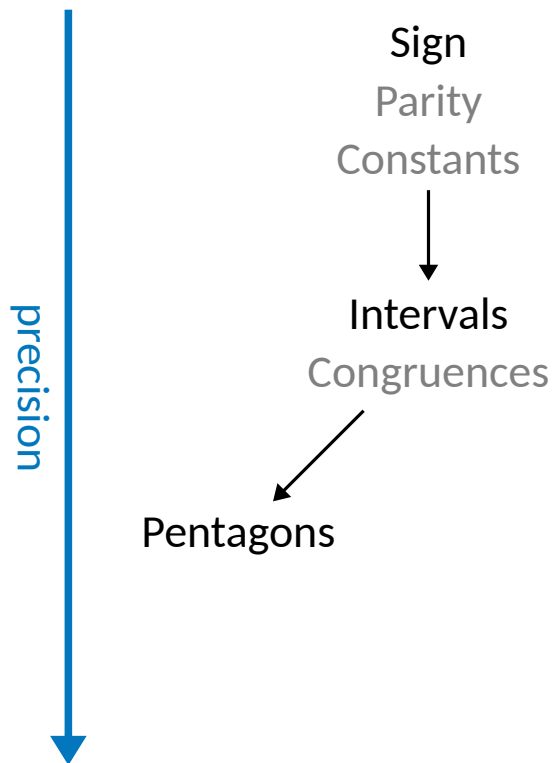


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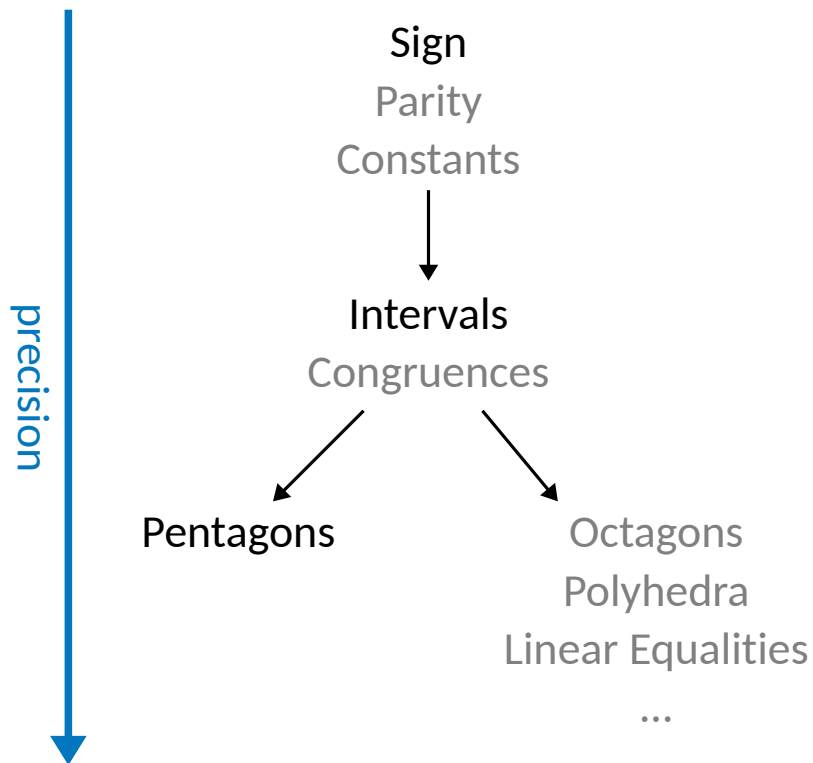


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- Rough precision
- Good scalability
- Enough for simple properties

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## Stability

- Non-relational (fast)
- Some relational reasoning
- Able to tell something about unknown values



# The starting point: a simple Solidity contract

```
1 contract Coin {
2     mapping (address => uint) public balances;
3     // [...]
4     function send(address dest, uint amount) public {
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- ▷ No-go for non-relational analyses: everything is  $\top$
- ▷ Relational analyses *might* learn something (but not in general)

# Our idea: tracking per-variable trends

Keep relations between different values of the same variable:

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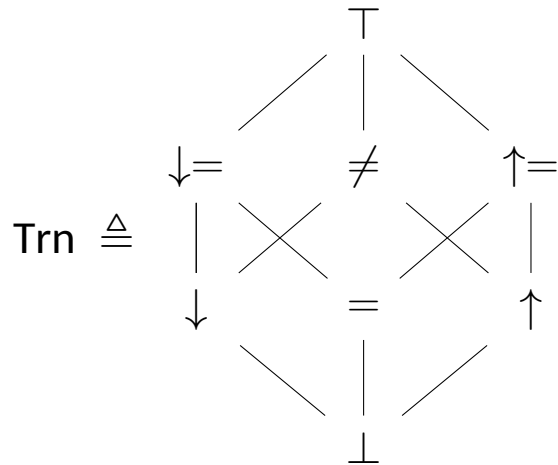
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- ▷ Needs information on some expressions (e.g., sign)

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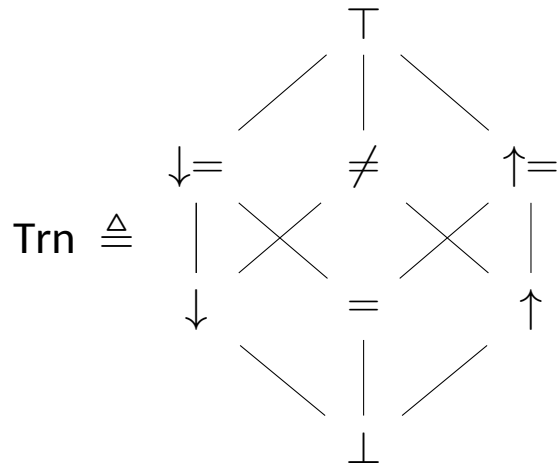
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The stability lattice:

$$\text{Stb} \triangleq \langle \text{Var} \rightarrow \text{Trn}, \sqsubseteq_{\text{Trn}}, \sqcup_{\text{Trn}}, \sqcap_{\text{Trn}}, \perp_{\text{stb}}, \top_{\text{stb}} \rangle$$

**Stb gives trends to variables w.r.t. the previous instruction**

# The Stability abstract domain (contd.)

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2. Combine over different paths with  $\sqcup_{\text{Trn}}$

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- Does  $x$  increase after  $x = x - y$ ?
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Stability works in **open product** with a numeric domain  $\mathcal{A}$ :

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**Practical note:** no product needed, only a pre-analysis

# Examples

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3 x = x + 3 * y  
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2.1.  $Q_{\mathcal{A}}(3 * y > 0) ?$  **X**



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2.2.  $Q_{\mathcal{A}}(3 * y < 0) ?$  **X**

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1 ...  
2 Sign = {x → -, y → 0+} Stb = {x → =, y → ↓=}  
3 x = x + 3 * y  
4 Sign = {x → ⊤, y → 0+} Stb = {x → =, y → =}  
5 ...
```

1. Reset all variables to =

2. Query Sign repeatedly

2.1.  $Q_{\mathcal{A}}(3 * y > 0) ? \text{X}$

2.2.  $Q_{\mathcal{A}}(3 * y < 0) ? \text{X}$

2.3.  $Q_{\mathcal{A}}(3 * y == 0) ? \text{X}$

# Examples

```
1 ...
2 Sign = {x → -, y → 0+} Stb = {x → =, y → ↓=}
3 x = x + 3 * y
4 Sign = {x → ⊤, y → 0+} Stb = {x → ↑=, y → =}
5 ...
```

1. Reset all variables to =

2. Query Sign repeatedly

2.1.  $Q_{\mathcal{A}}(3 * y > 0) ?$  ✗

2.2.  $Q_{\mathcal{A}}(3 * y < 0) ?$  ✗

2.3.  $Q_{\mathcal{A}}(3 * y == 0) ?$  ✗

2.4.  $Q_{\mathcal{A}}(3 * y \geq 0) ?$  ✓

# Examples

```
1 ...  
2 Sign = {x → -, y → 0+} Stb = {x → =, y → ↓=}  
3 x = x + 3 * y  
4 Sign = {x → ↑, y → 0+} Stb = {x → ↑=, y → =}  
5 ...
```

1. Reset all variables to =

2. Query Sign repeatedly

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2.3.  $Q_{\mathcal{A}}(3 * y == 0) ?$  ✗

2.4.  $Q_{\mathcal{A}}(3 * y \geq 0) ?$  ✓

2.5. ...

# Examples (contd.)

```
1 ...  
2 Sign = {x → -, y → +} Stb = {x → =, y → ↓=}  
3 x = x * (y + 2)  
4 Sign = {x → -, y → +} Stb = {x → =, y → =}  
5 ...
```

1. Reset all variables to =
2. Query Sign repeatedly

# Examples (contd.)

```
1 ...  
2 Sign = {x → -, y → +} Stb = {x → =, y → ↓=}  
3 x = x * (y + 2)  
4 Sign = {x → -, y → +} Stb = {x → =, y → =}  
5 ...
```

1. Reset all variables to =
2. Query Sign repeatedly

2.1.  $Q_{\mathcal{A}}(x == 0) \vee$

$Q_{\mathcal{A}}((y + 2) == 1) ? \mathbf{X}$

# Examples (contd.)

```
1 ...
2 Sign = {x → -, y → +} Stb = {x → =, y → ↓=}
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4 Sign = {x → -, y → +} Stb = {x → =, y → =}
5 ...
```

1. Reset all variables to =

2. Query Sign repeatedly

2.1.  $Q_{\mathcal{A}}(x == 0) \vee$

$Q_{\mathcal{A}}((y + 2) == 1) ? \mathbf{X}$

2.2.  $Q_{\mathcal{A}}(x < 0 \ \&\& \ (y + 2) > 1) \vee$

$Q_{\mathcal{A}}(x > 0 \ \&\& \ (y + 2) < 1) ? \mathbf{X}$

# Examples (contd.)

```
1 ...
2 Sign = {x → -, y → +} Stb = {x → =, y → ↓=}
3 x = x * (y + 2)
4 Sign = {x → -, y → +} Stb = {x → =, y → =}
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```

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# Examples (contd.)

```
1 ...  
2 Sign = {x → -, y → +} Stb = {x → =, y → ↓=}  
3 x = x * (y + 2)  
4 Sign = {x → -, y → +} Stb = {x → T, y → =}  
5 ...
```

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$Q_{\mathcal{A}}((y + 2) == 1) ? \mathbf{X}$

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$Q_{\mathcal{A}}(x > 0 \ \&\& \ (y + 2) > 1) ? \mathbf{X}$

2.4. ...

# Examples (contd.)

```
1 ...
2 Intv = {x → [-12, -3], y → [1, +∞]} Stb = {x → =, y → ↓=}
3 x = x * (y + 2)
4 Intv = {x → [-∞, -9], y → [1, +∞]} Stb = {x → ↓, y → =}
5 ...
```

1. Reset all variables to =

2. Query Intv repeatedly

2.1.  $Q_{\mathcal{A}}(x == 0) \vee$

$Q_{\mathcal{A}}((y + 2) == 1) ? \times$

2.2.  $Q_{\mathcal{A}}(x < 0 \ \&\& \ (y + 2) > 1) \vee$

$Q_{\mathcal{A}}(x > 0 \ \&\& \ (y + 2) < 1) ? \checkmark$

2.3.  $Q_{\mathcal{A}}(x < 0 \ \&\& \ (y + 2) < 1) \vee$

$Q_{\mathcal{A}}(x > 0 \ \&\& \ (y + 2) > 1) ? \times$

2.4. ...

**Where can this  
be applied?**

# Covariance and Contravariance

```
1 contract Coin {
2   mapping (address => uint) public balances;
3   // [...]
4   function send(address dest, uint amount) public {
5     require(amount > 0);
6     require(amount <= balances[msg.sender]);
7     balances[msg.sender] -= amount;
8     balances[dest] += amount;
9     {dest → =, amount → =, balances[msg.sender] → ↓, balances[dest] → ↑}
10  }
11 }
```

▷ Weak relation between pairs/groups of variables

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- ▷ Weak relation between pairs/groups of variables
- ▷ Byproduct of the chained Stability
- ▷ Can be used to prove functional requirements

# Termination (light)

```
1 int foo(int x, int y) {  
2  
3     while (x > 0 && y > 0) {  
4  
5         y = 2 * y;  
6  
7         x = x - 1;  
8  
9     }  
10 }  
11  
12 return x + y;  
13  
14 }
```

▷ Analyze the program with Stability

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1 int foo(int x, int y) {  
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14 }
```

- ▷ Analyze the program with Stability
- ▷ Chain Stability info at end of loops

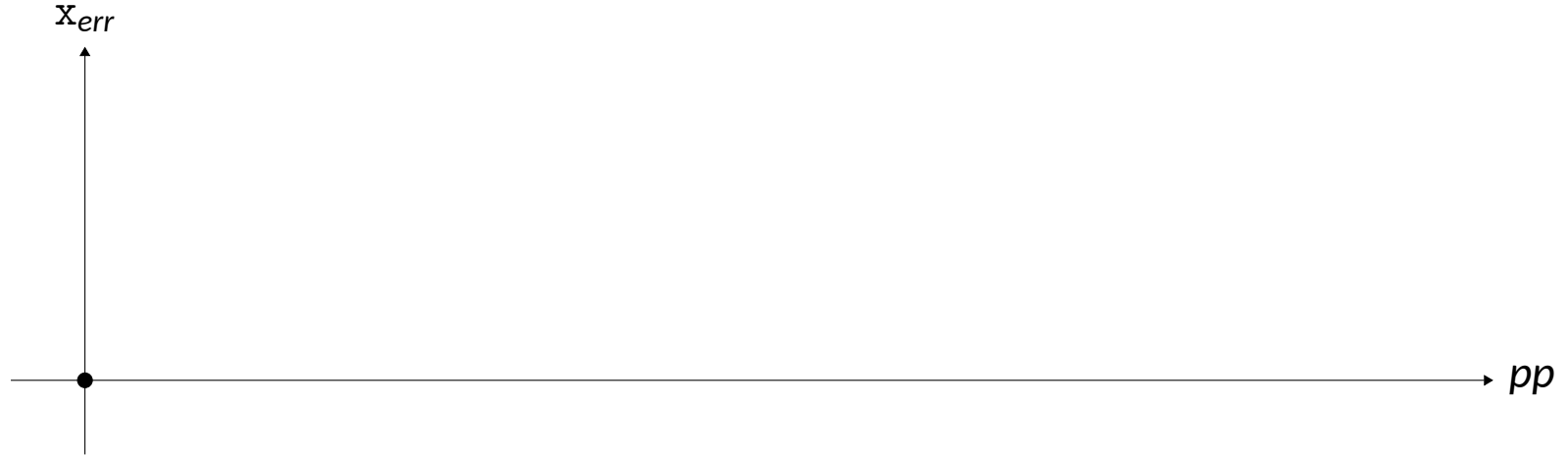
# Termination (light)

```
1 int foo(int x, int y) {  
2   {x ↦ =, y ↦ =}  
3   while (x > 0 && y > 0) {  
4     {x ↦ ↓, y ↦ =}  
5     y = 2 * y;  
6     {x ↦ =, y ↦ ↑}  
7     x = x - 1;  
8     {x ↦ ↓, y ↦ =}  
9     {x ↦ ↓, y ↦ ↑}  
10  }  
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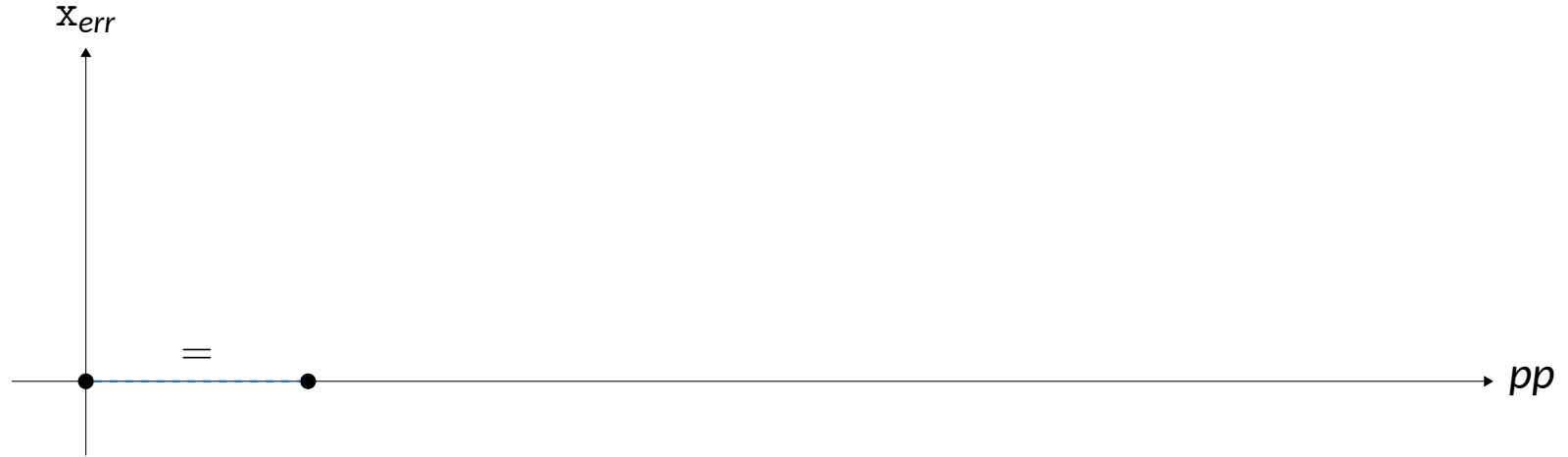
- ▷ Analyze the program with Stability
- ▷ Chain Stability info at end of loops
- ▷ Chained information can sometimes prove termination



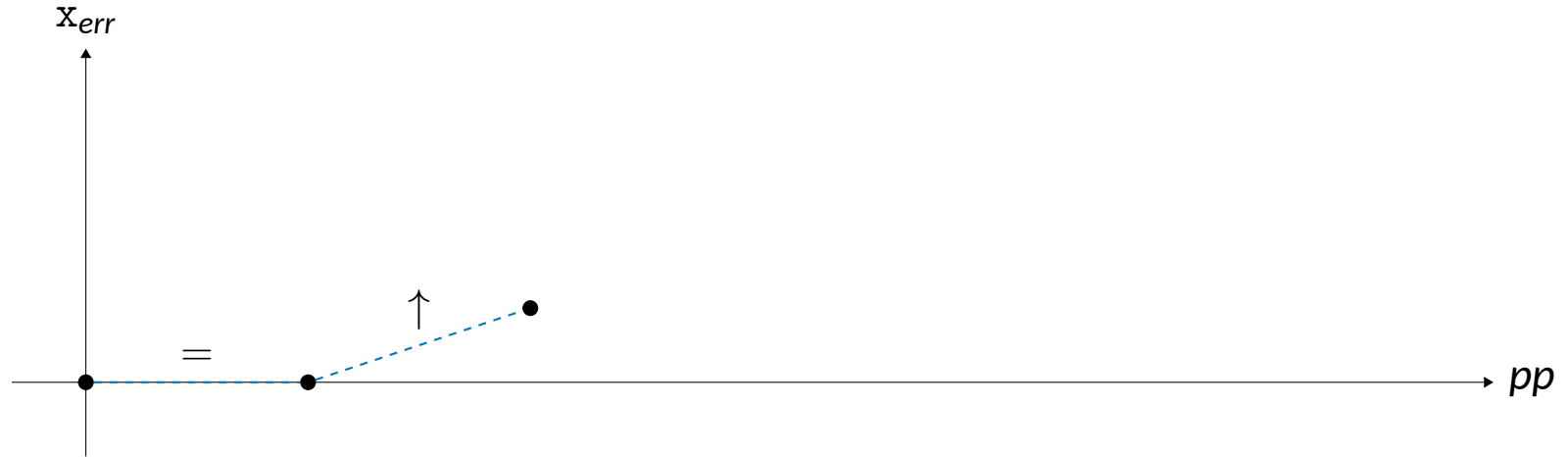
# Floating point error



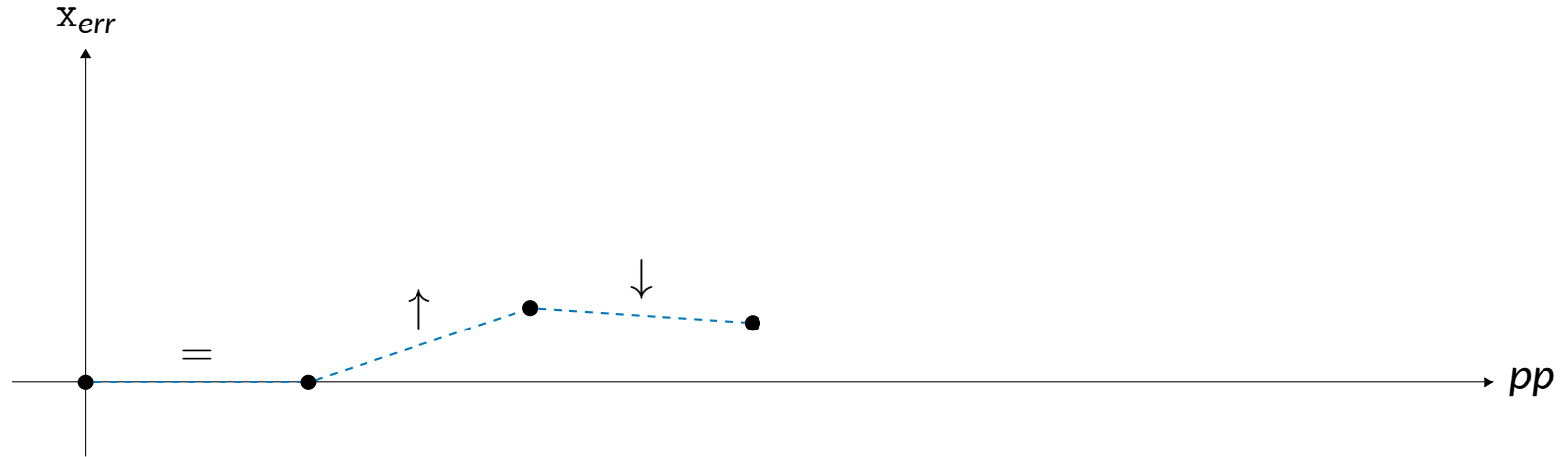
# Floating point error



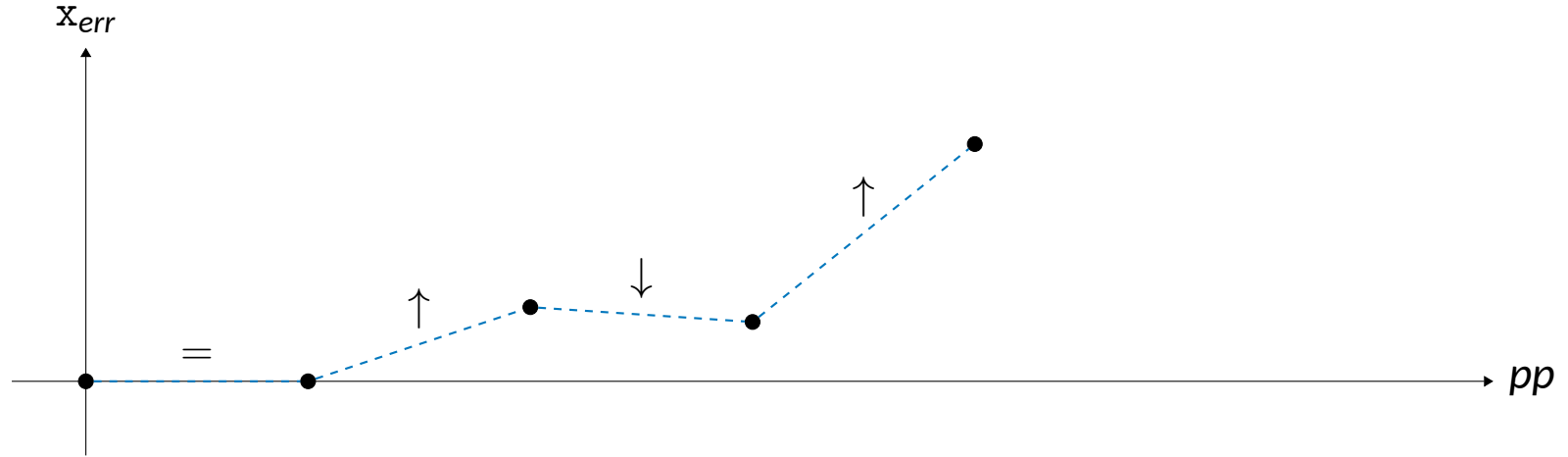
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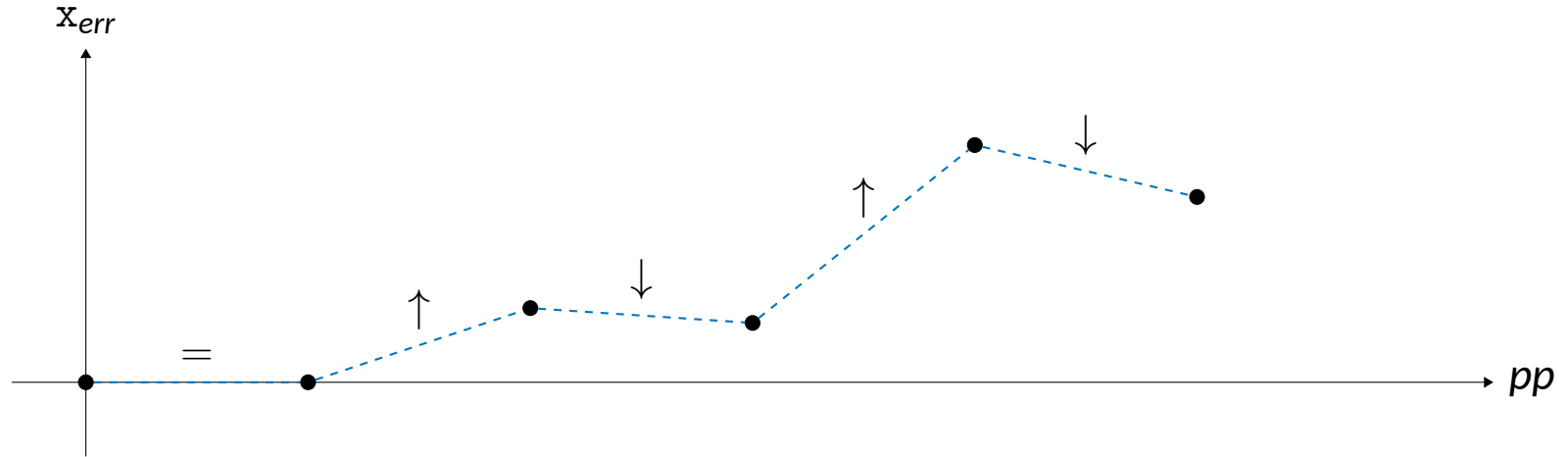
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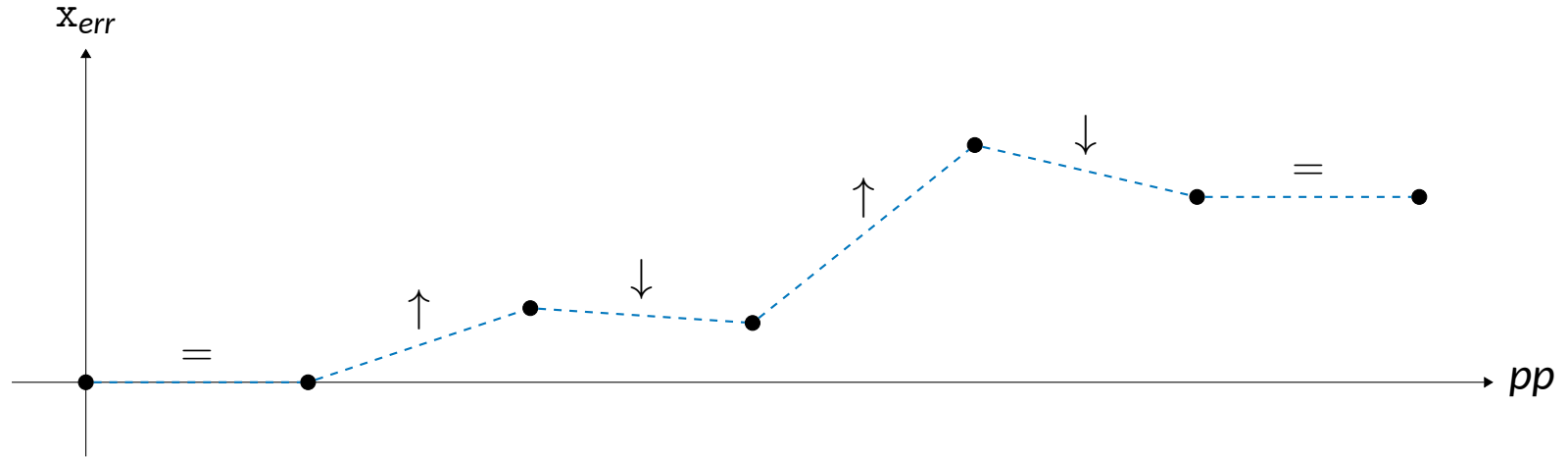
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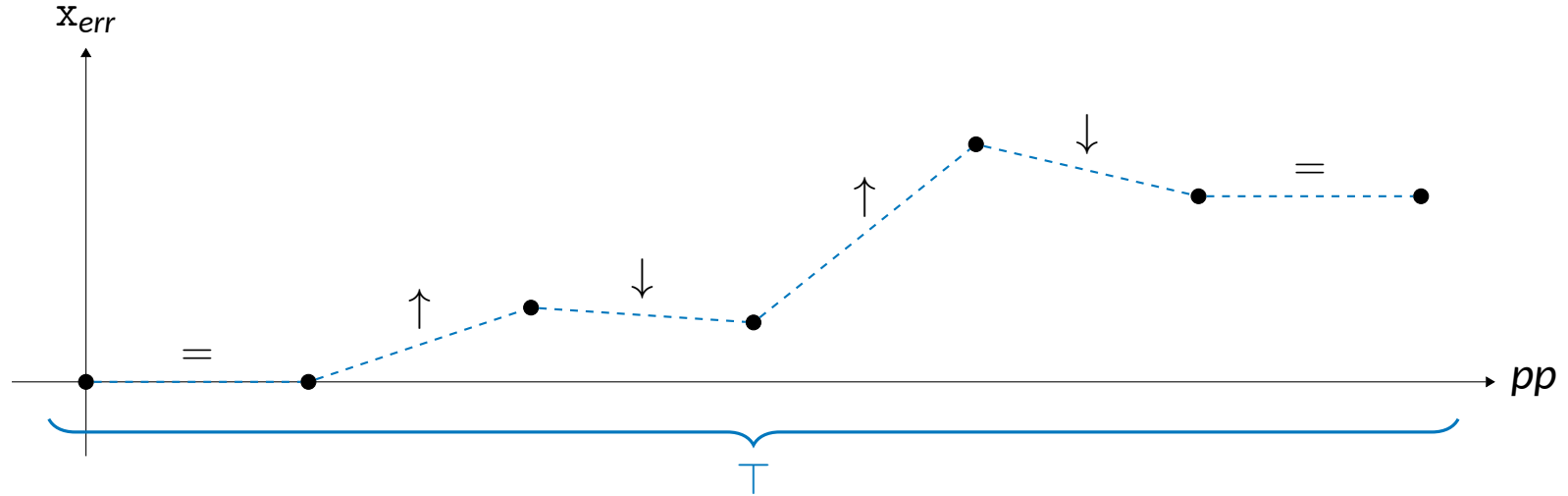
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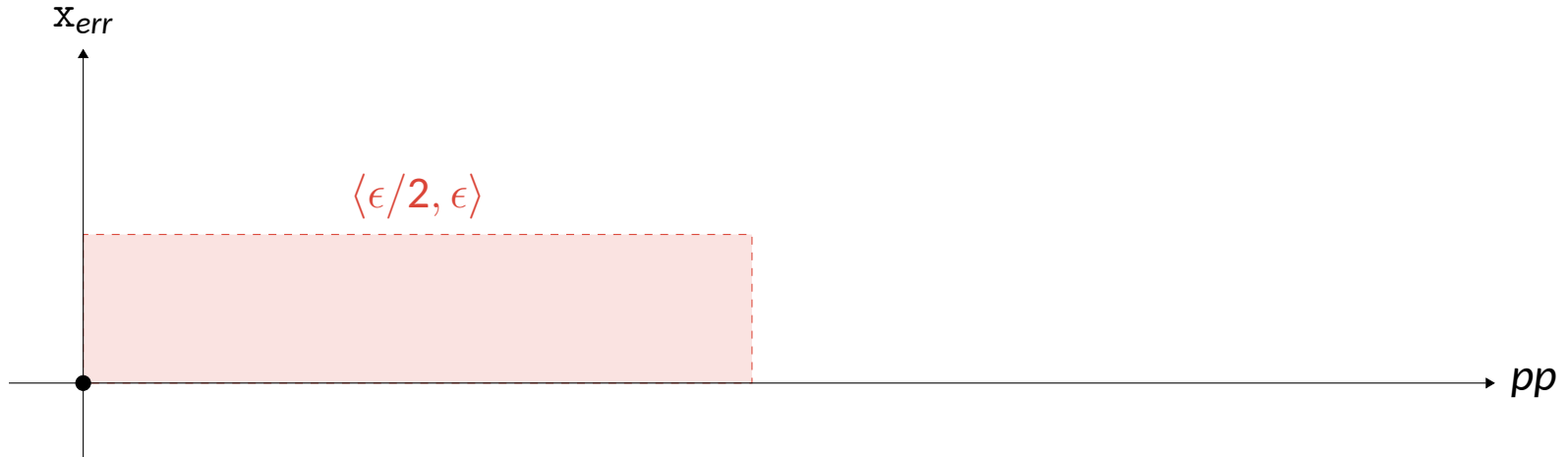


Tiny fluctuations cause the trend to be unstable too quickly



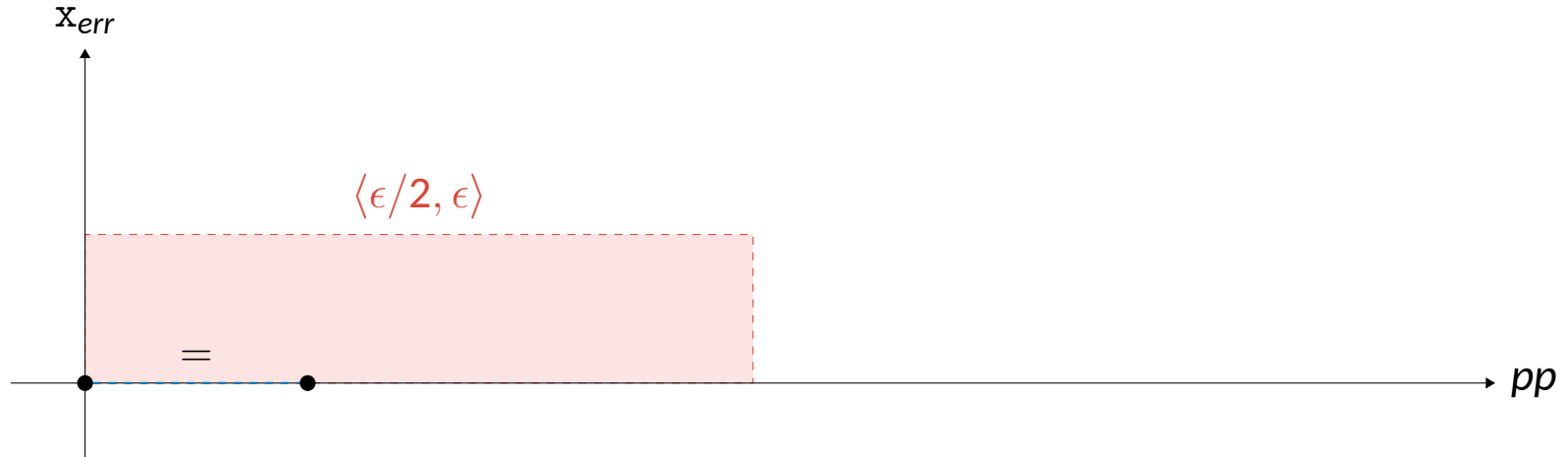
# Floating point error (contd.)

Main idea: introduce a sliding tolerance window  $\langle \rho, \epsilon \rangle$ :



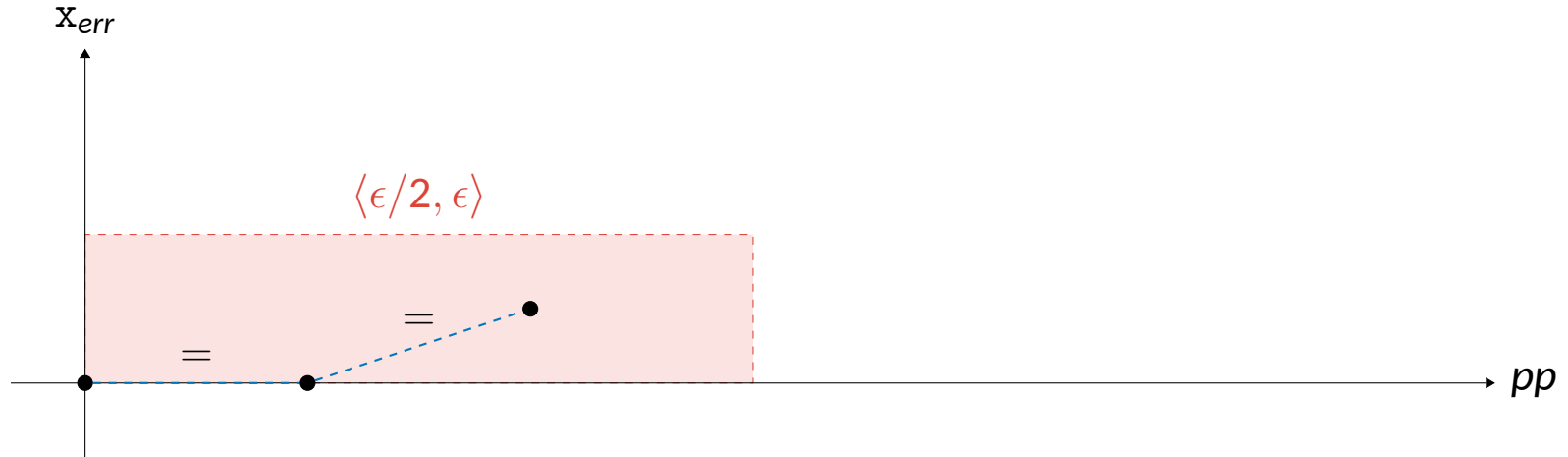
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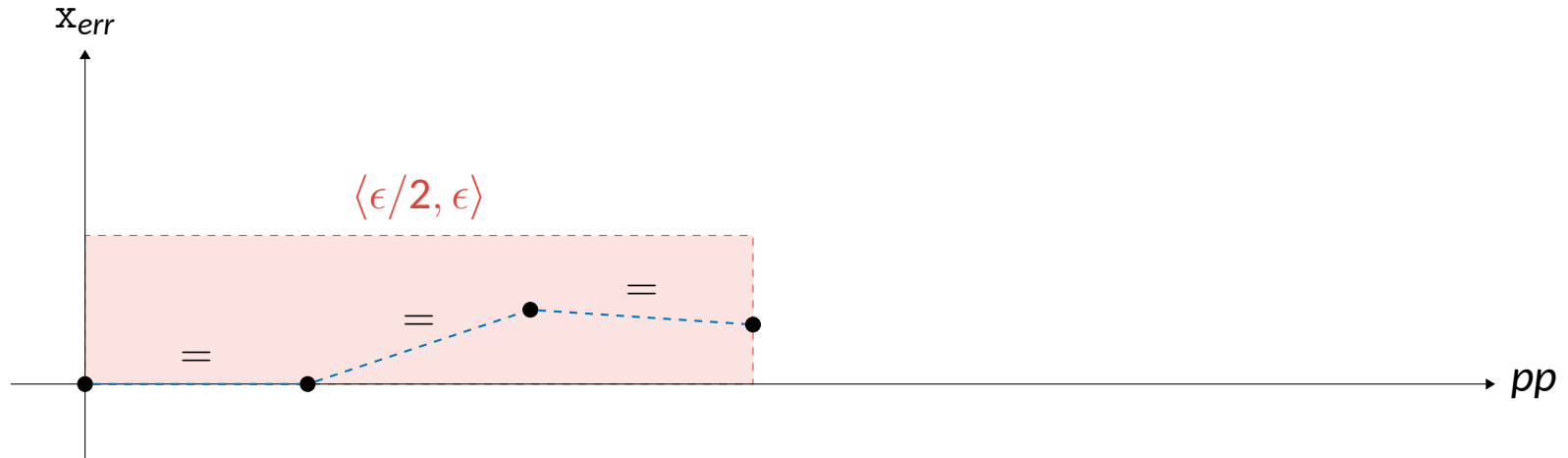
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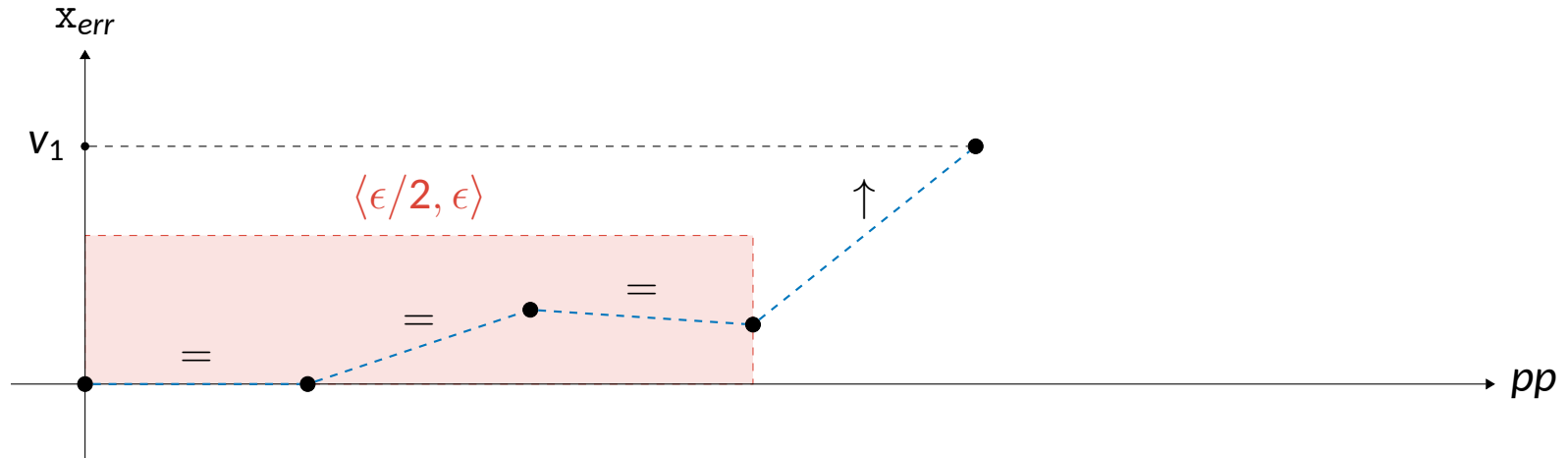
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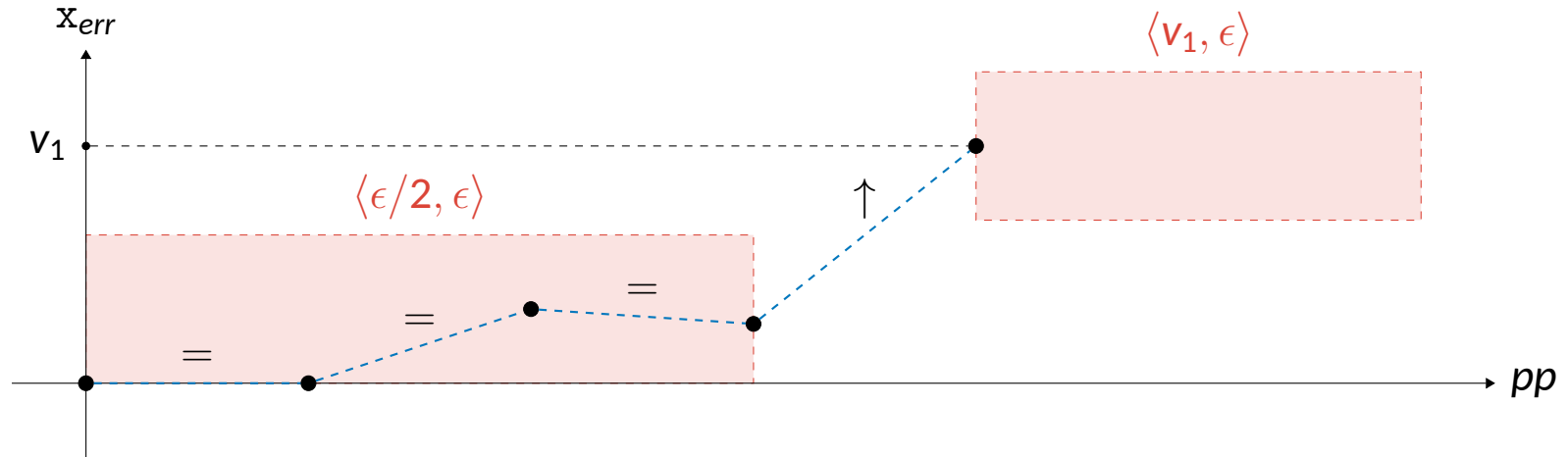
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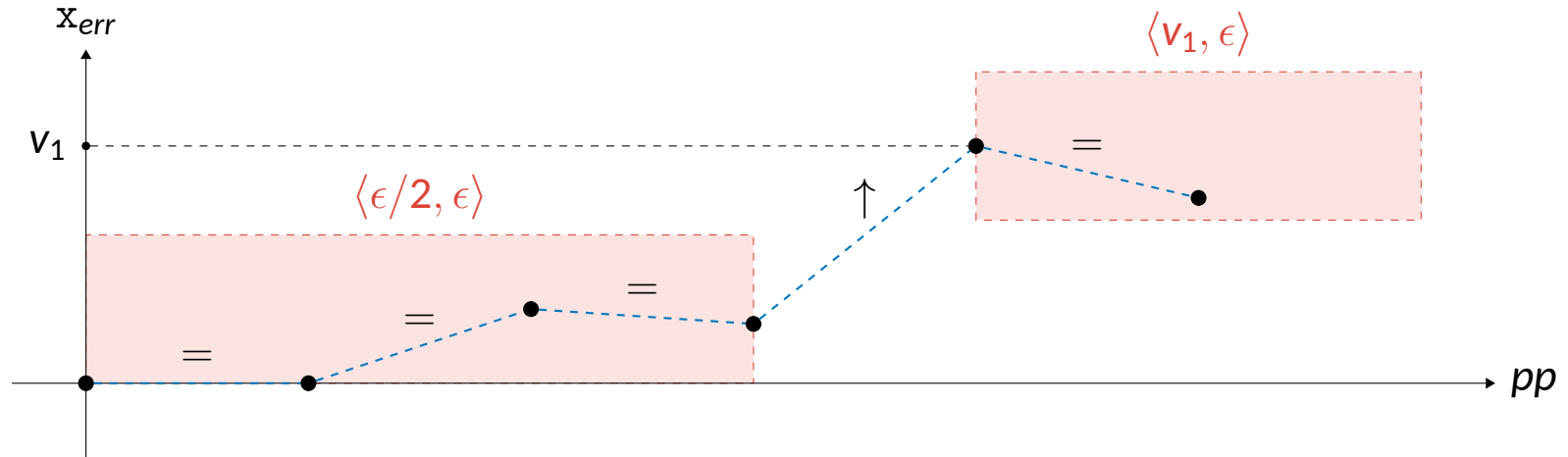
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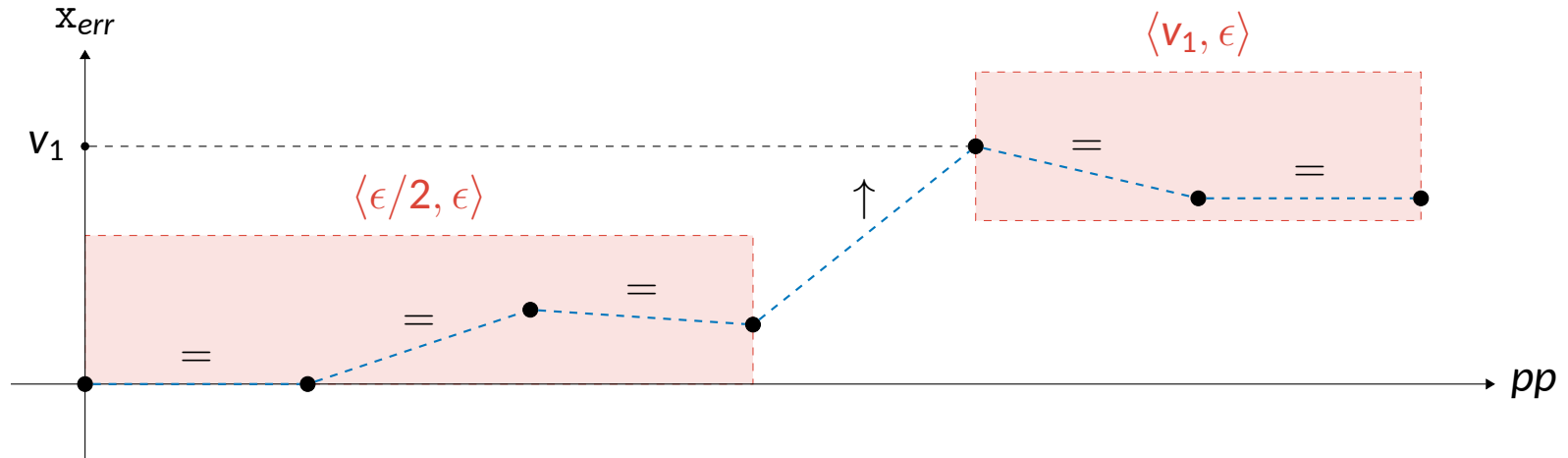
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# Floating point error (contd.)

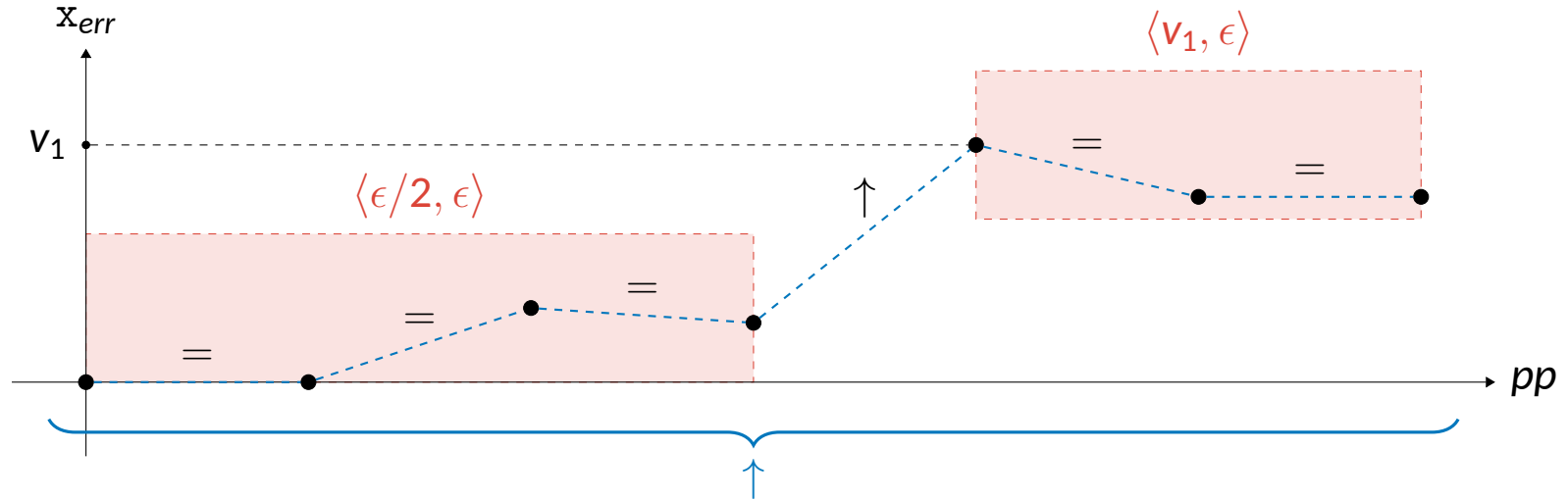
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# Floating point error (contd.)

Main idea: introduce a sliding tolerance window  $\langle \rho, \epsilon \rangle$ :



We can show stability up to  $\epsilon$ !

# Summing up

Stability is a new abstract domain for numerical trends

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- Benchmarks needed to confirm scalability



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Stability is a new abstract domain for numerical trends

- Relates values of the same variable at different program points
- Able to track information on  $\top$  values for other non-relational domains
- Fast: non-relational and finite

Stability is a work in progress

- Still searching for a target application
- Benchmarks needed to confirm scalability
- Proofs needed once we settle on the semantics

# Thanks!

[luca.negrini@unive.it](mailto:luca.negrini@unive.it)