

Polynomial Time Inverse Computation for Accumulative Functions with Multiple Data Traversals

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Jan. 23rd, 2012 @ PEPM 2012

Inverse Computation

Problem: Inverse Computation

Given a program f and its output t ,
find all s such that $f(s) = t$.

► For $\text{add}(_, Z)$ and $S(Z)$, inv-comp
returns $S(Z)$

$$\begin{array}{lcl} \text{add}(Z, y) & = & y \\ \text{add}(S(x), y) & = & S(\text{add}(x, y)) \end{array}$$

Applications

- ▶ Deriving deserializer from serializer
- ▶ Supporting Undo
- ▶ Efficient test-case generation
[Runciman+ 08, Christiansen&Fischer 08]
 - What x makes $\text{pred}(x)$ true?

This Talk

- ▶ We propose an inv-comp method ...
 - works for a class of functions called parameter-linear macro tree transducers
 - **accumulative functions**
 - **multiple data traversals**
- runs in time **polynomial** to the size of a given output

} **difficult
to handle**

This Talk

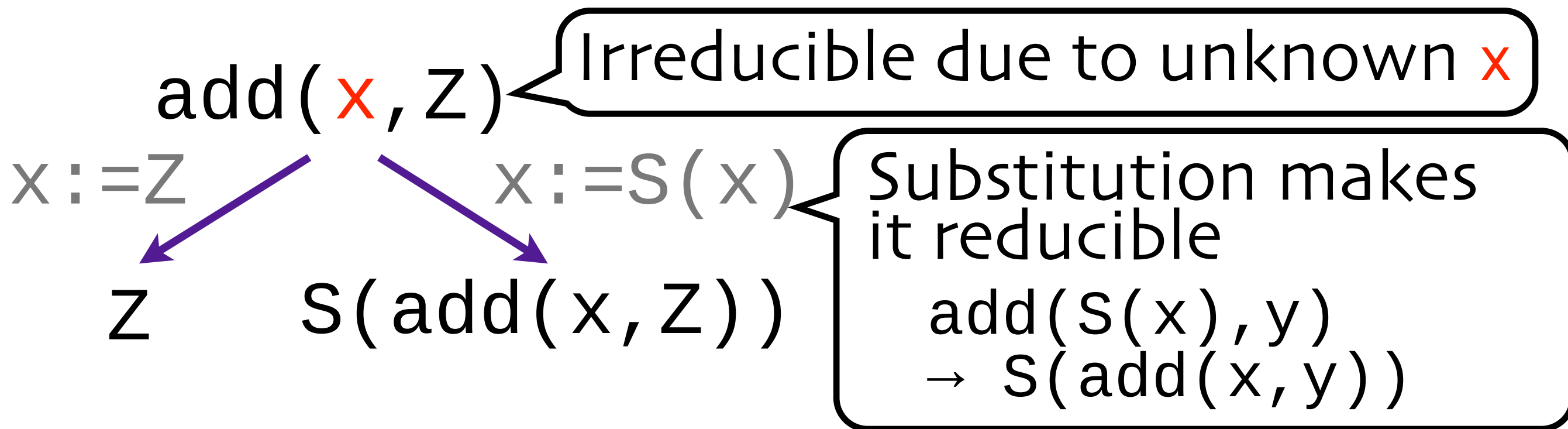
- ▶ We propose an inv-comp method ...
 - works for a class of functions called parameter-linear macro tree transducers
 - **accumulative functions**
 - **multiple data traversals**
- } **difficult to handle**
But, why?
- runs in time **polynomial** to the size of a given output

Review: Existing Method

- ▶ An existing inv-comp method
 - known as
 - (Needed) **Narrowing** [Antoy+ 00]
 - URA [Abramov&Glück 02]
 - SLD resolution
 - used in logic programming languages
 - Curry, Prolog
 - based on symbolic computation

(Needed) Narrowing

- ▶ A symbolic computation
 - substitution followed by reduction



$\text{add}(Z, y)$	$=$	y
$\text{add}(S(x), y)$	$=$	$S(\text{add}(x, y))$

InvComp = Narrowing+EqChk

$\text{add}(Z, y)$	$= y$
$\text{add}(S(x), y)$	$= S(\text{add}(x, y))$

$\text{add}(x, Z) == S(Z)$

InvComp = Narrowing+EqChk

$$\begin{array}{lcl} \text{add}(Z, y) & = & y \\ \text{add}(S(x), y) & = & S(\text{add}(x, y)) \end{array}$$

$$\text{add}(\textcolor{red}{x}, Z) == S(Z)$$

$x := Z$



InvComp = Narrowing+EqChk

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$$Z == S(Z)$$



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↓
Fail

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$x := S(x)$

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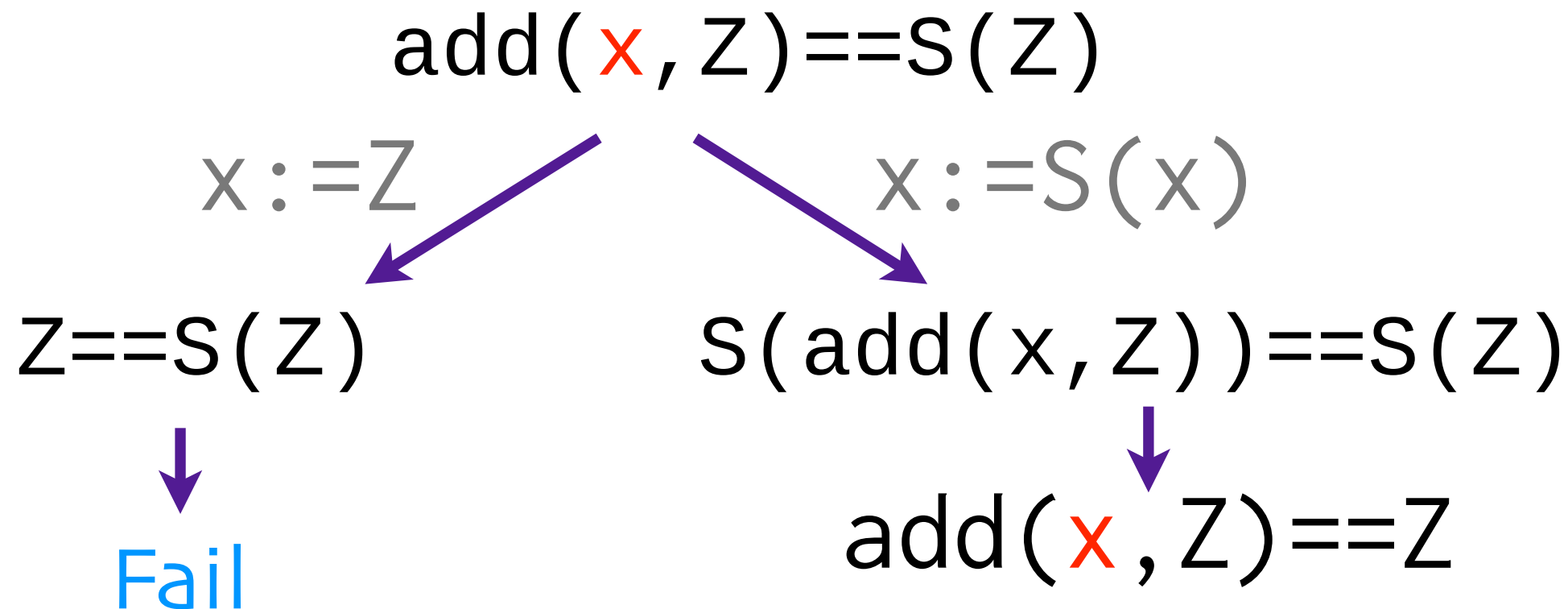
$$Z == S(Z)$$

$$S(\text{add}(x, Z)) == S(Z)$$

↓
Fail

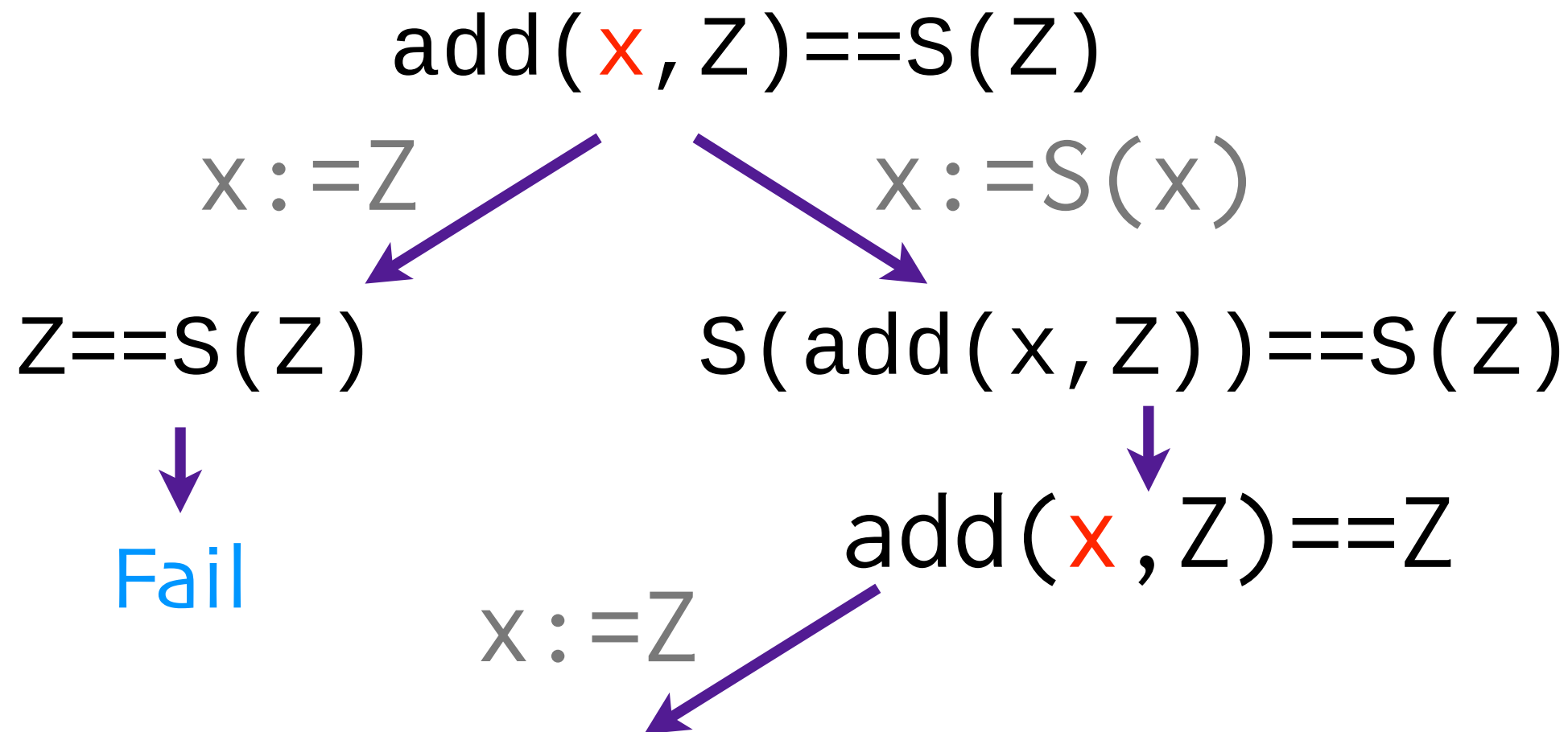
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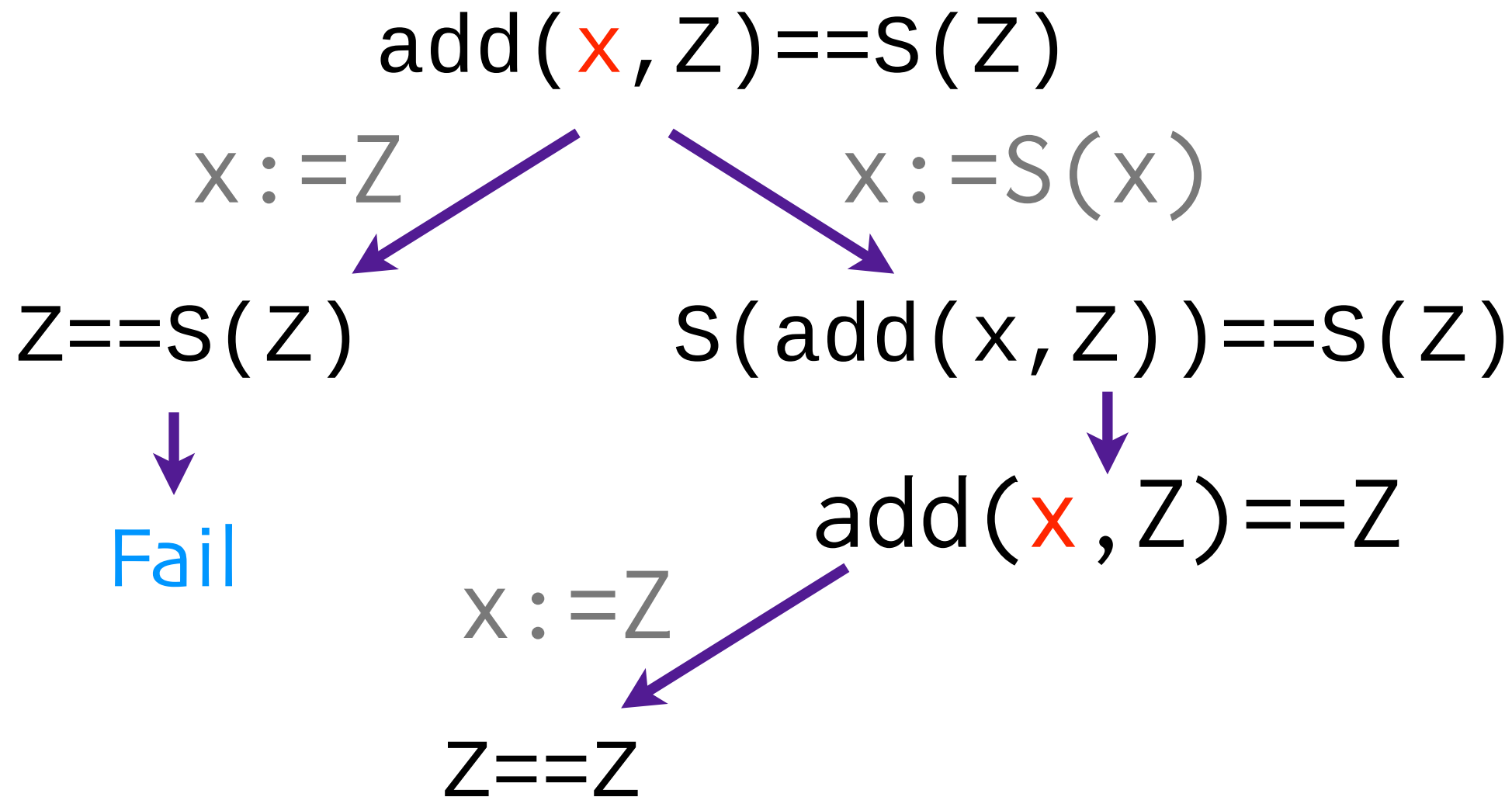
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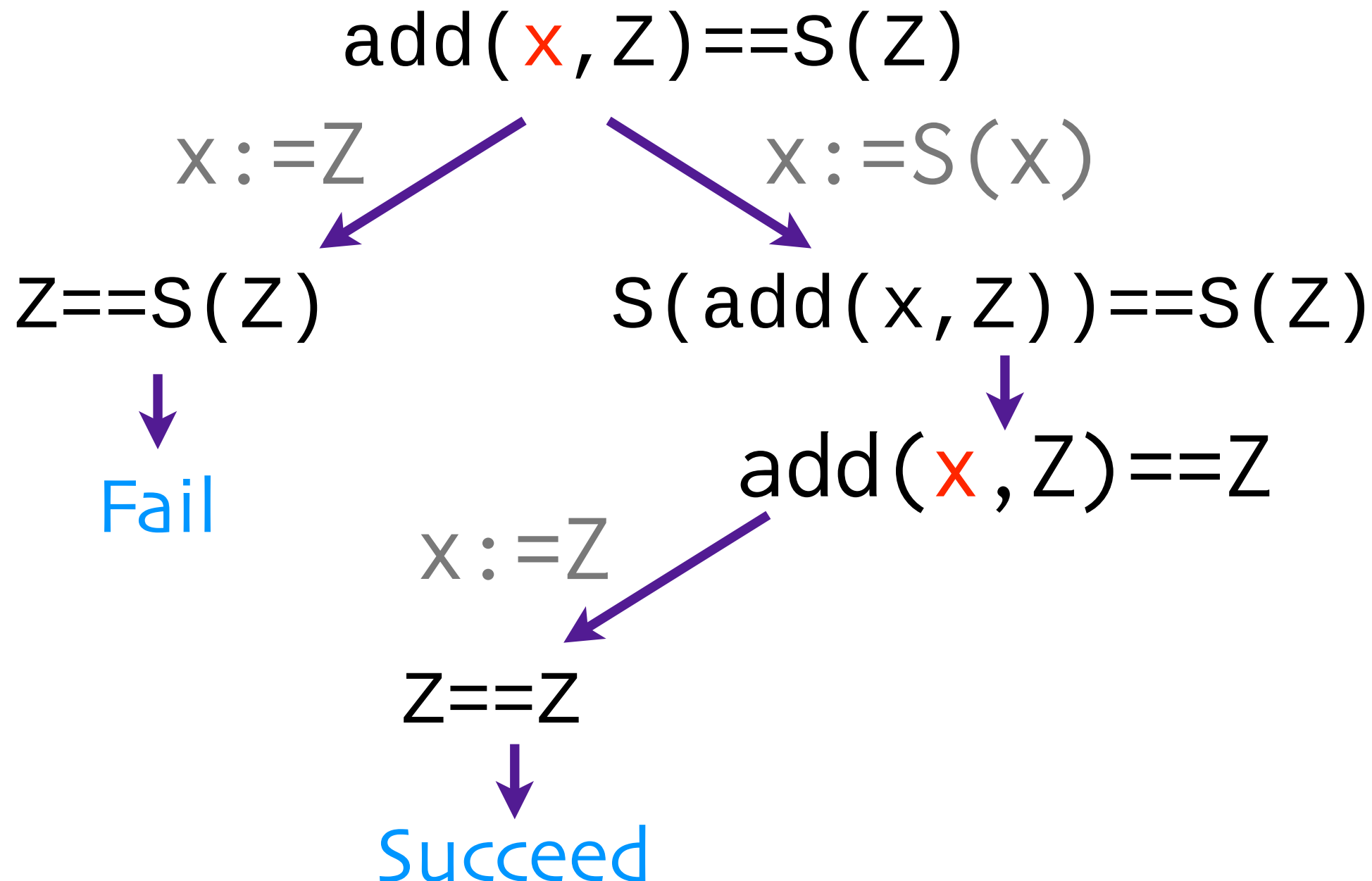
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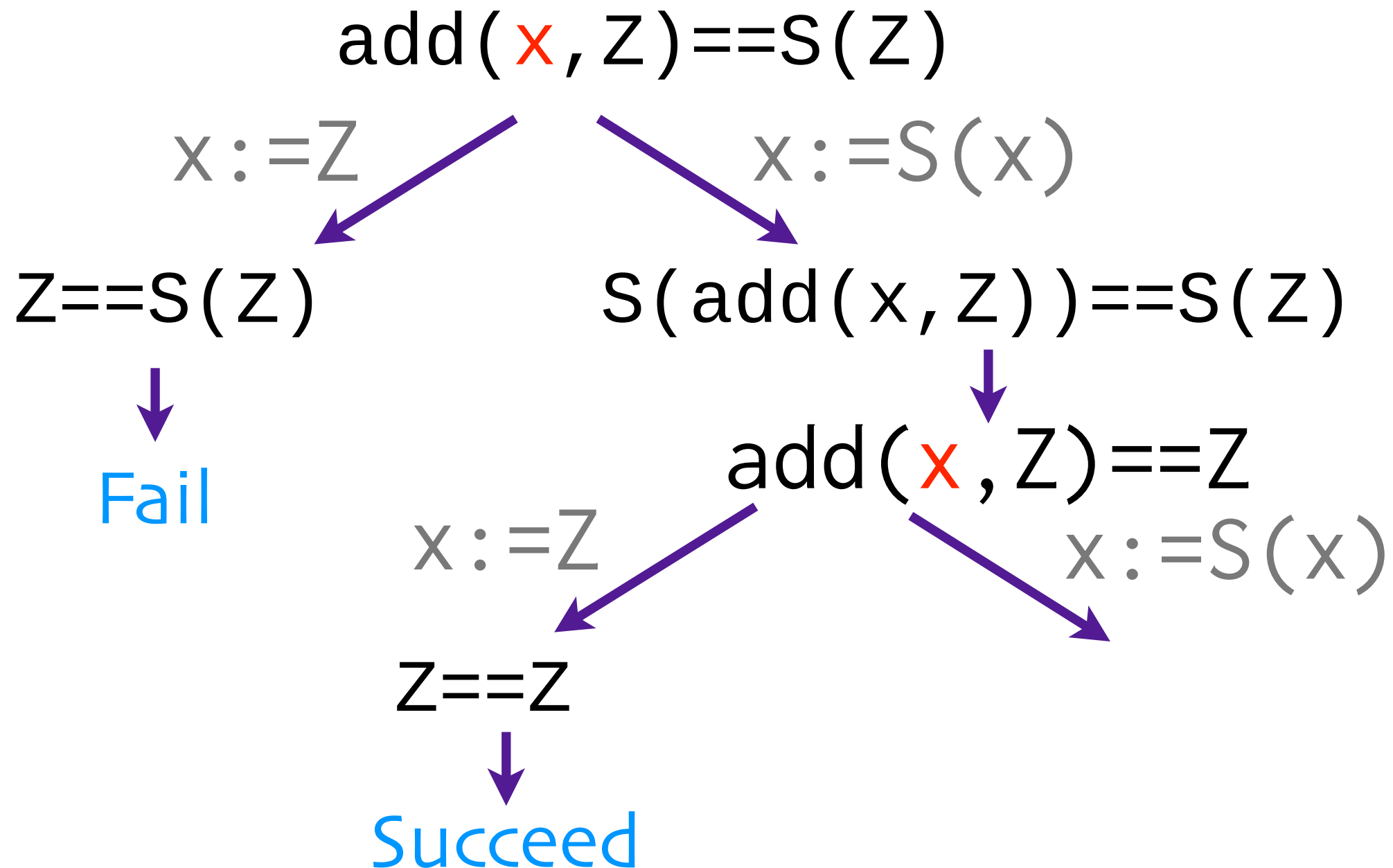
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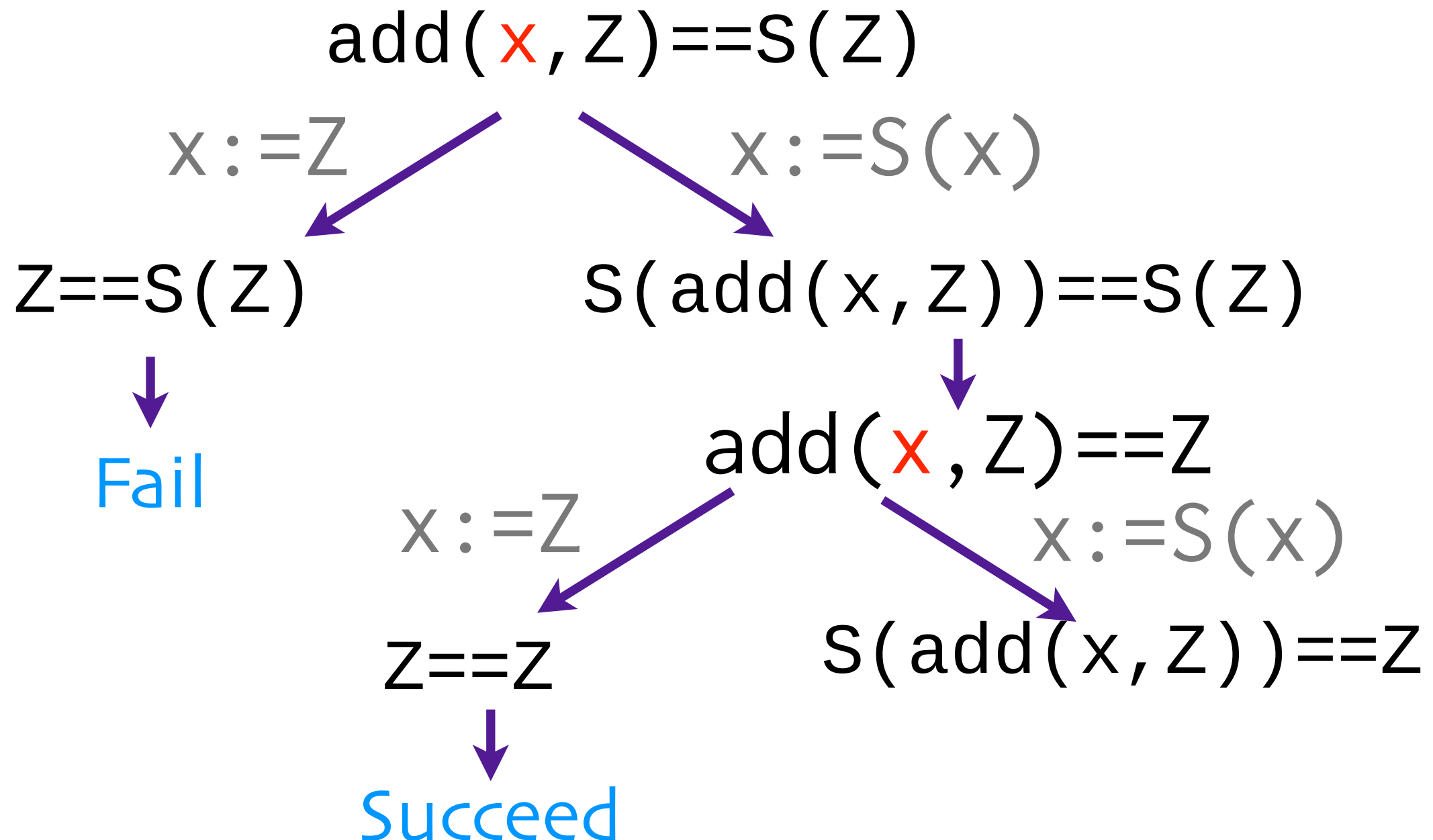
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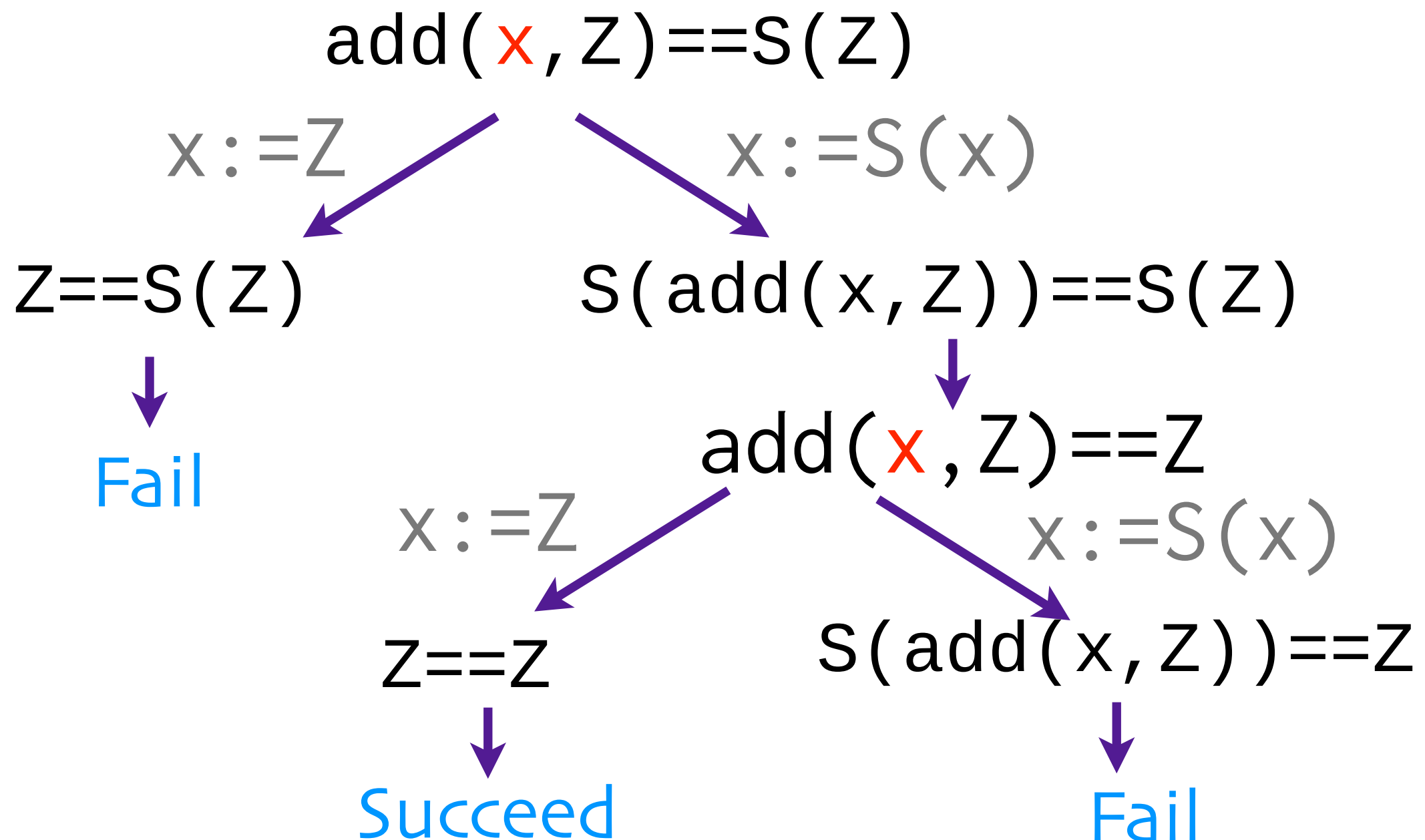
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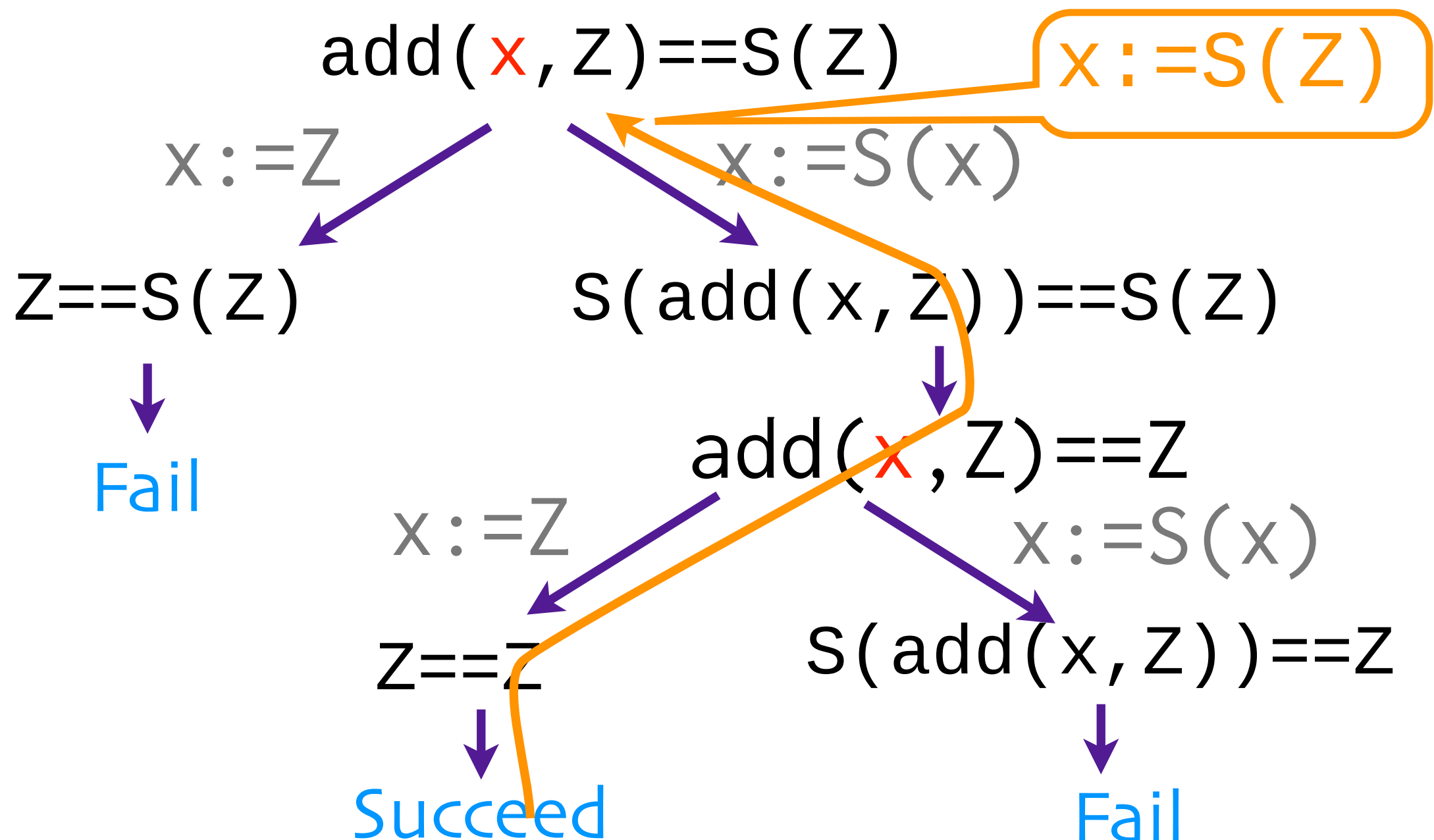
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Problem Overview

- ▶ This simple inverse computation usually runs infinitely for programs ...
 - with accumulations and multiple data traversals

$$\begin{aligned} \text{exp}(x) &= \text{ex}(x, Z) \\ \text{ex}(Z, y) &= S(y) \\ \text{ex}(S(x), y) &= \text{ex}(x, \text{ex}(x, y)) \end{aligned}$$

multiple data traversal accumulation

$$\text{NB: } \text{exp}(S^n(Z)) = S^{2^n}(Z)$$

Non-Terminating InvComp

$\begin{aligned}\text{exp}(x) &= \text{ex}(x, Z) \\ \text{ex}(Z, y) &= S(y) \\ \text{ex}(S(x), y) &= \text{ex}(x, \text{ex}(x, y))\end{aligned}$
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$\text{exp}(x) == Z$ (expected to report “no ans”)

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Non-Terminating InvComp

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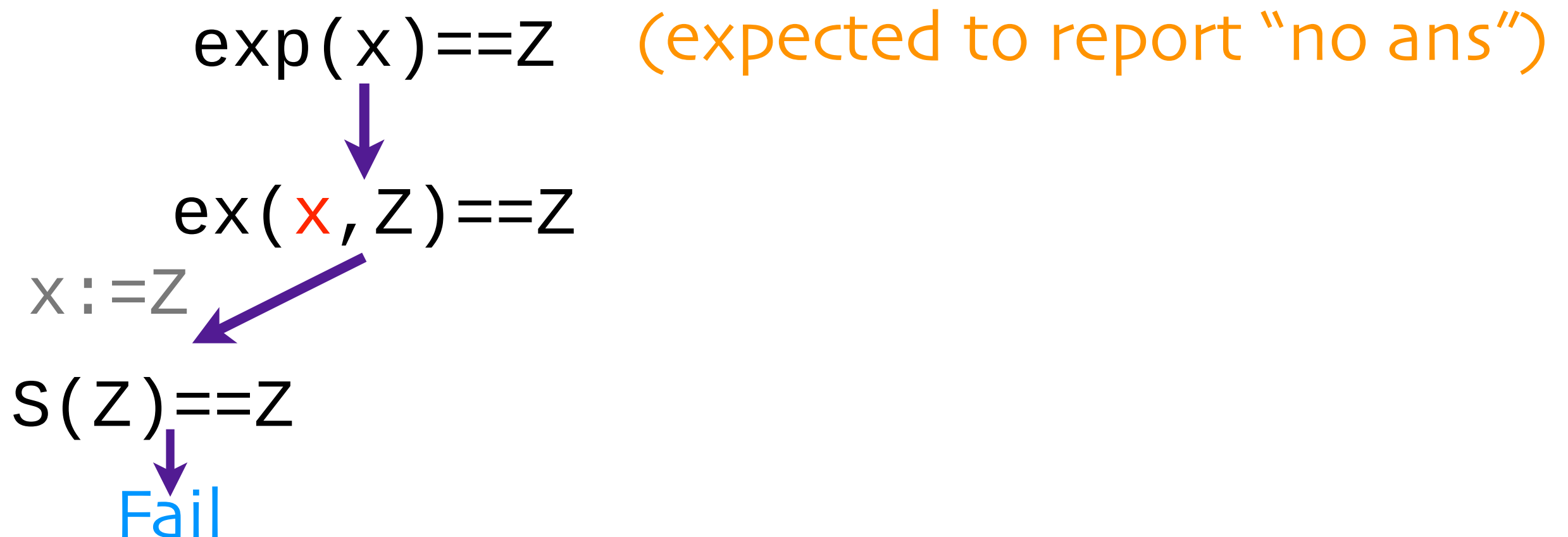
$x := Z$

$S(Z) == Z$

Non-Terminating InvComp

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$\text{ex}(Z, y) = S(y)$
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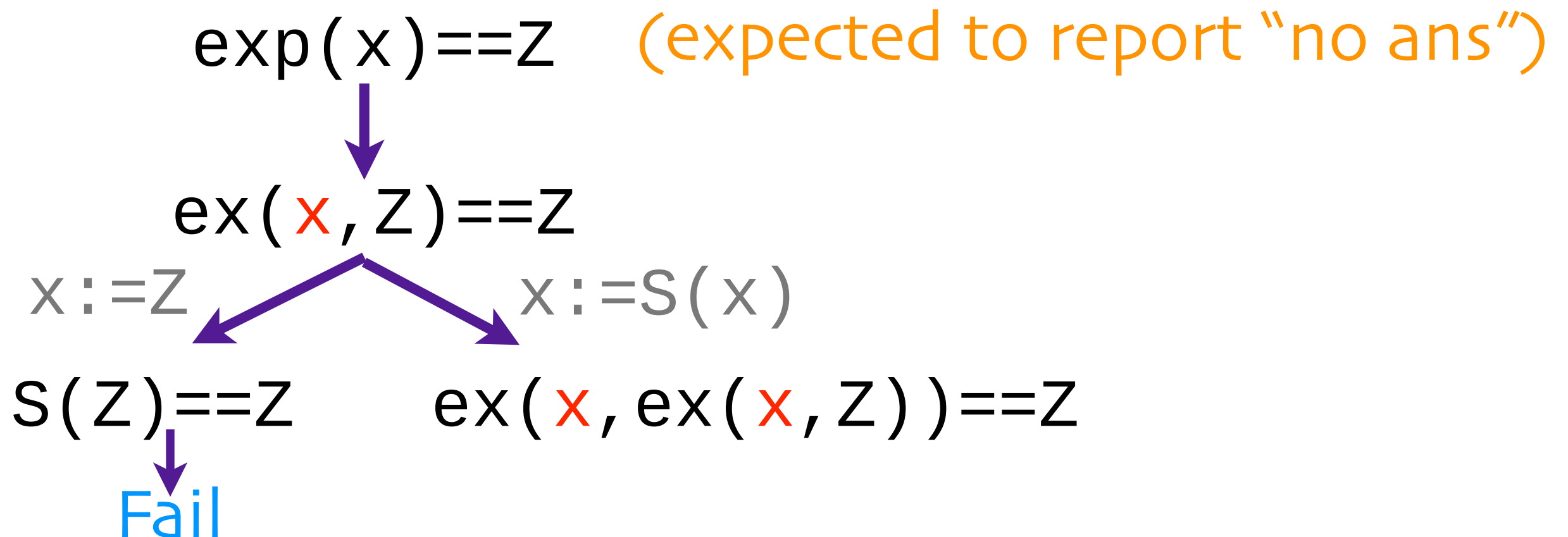
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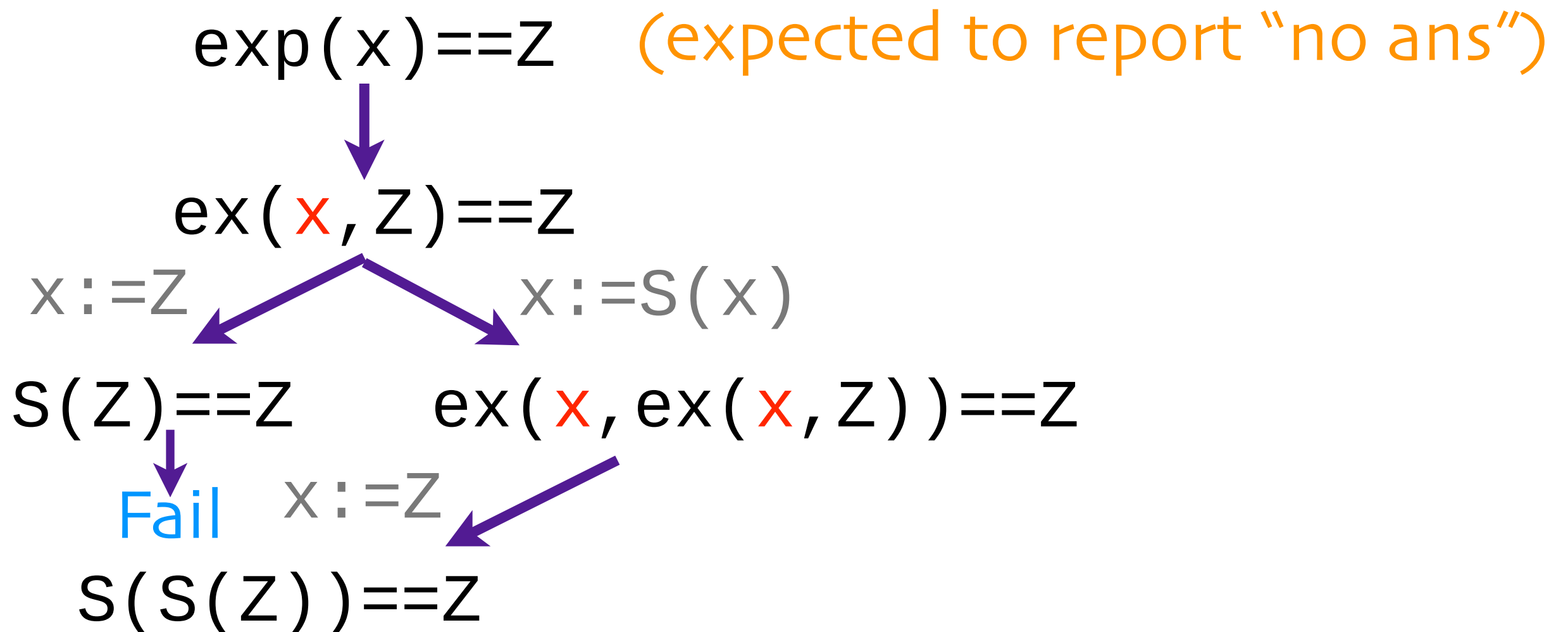
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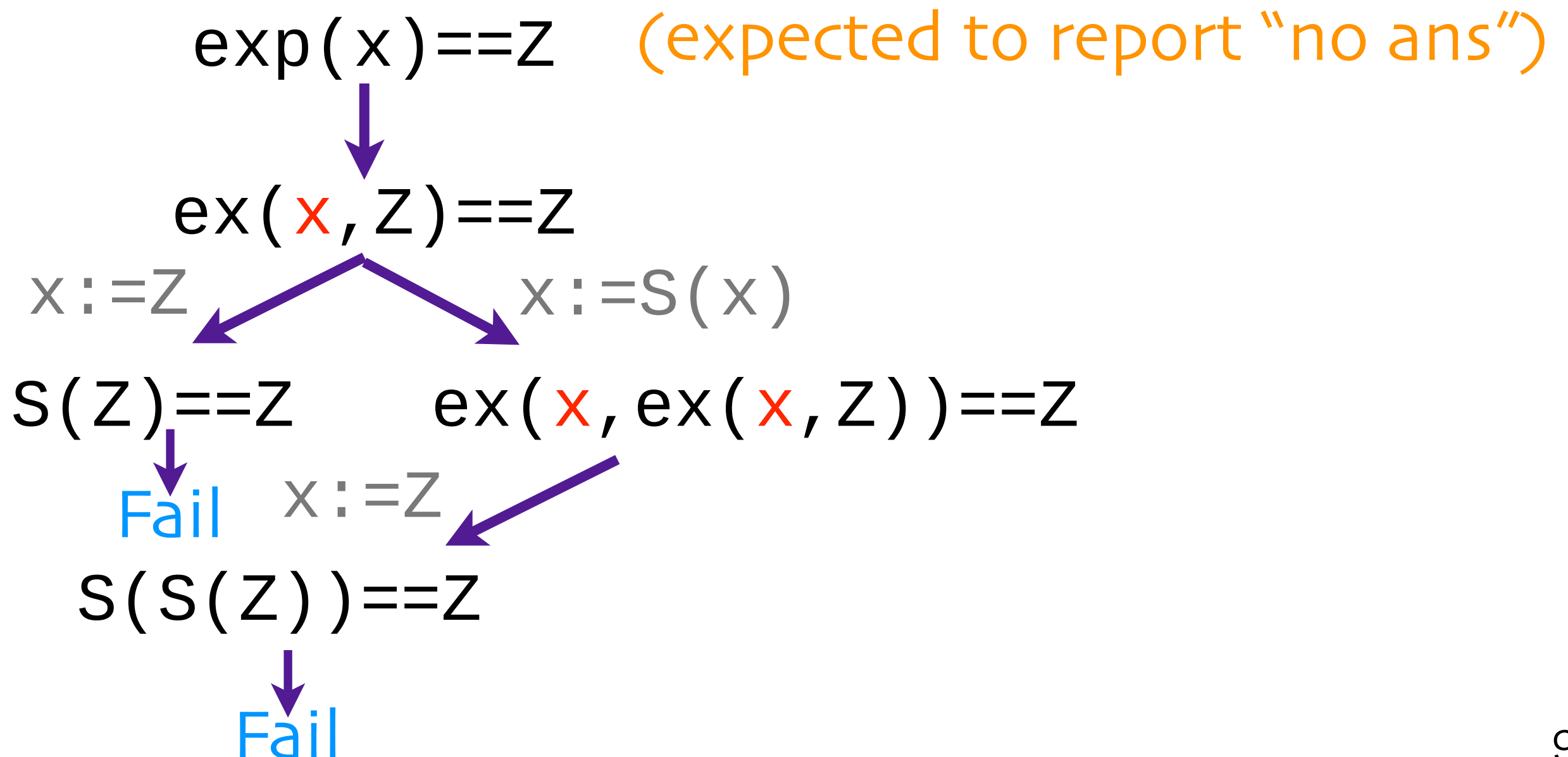
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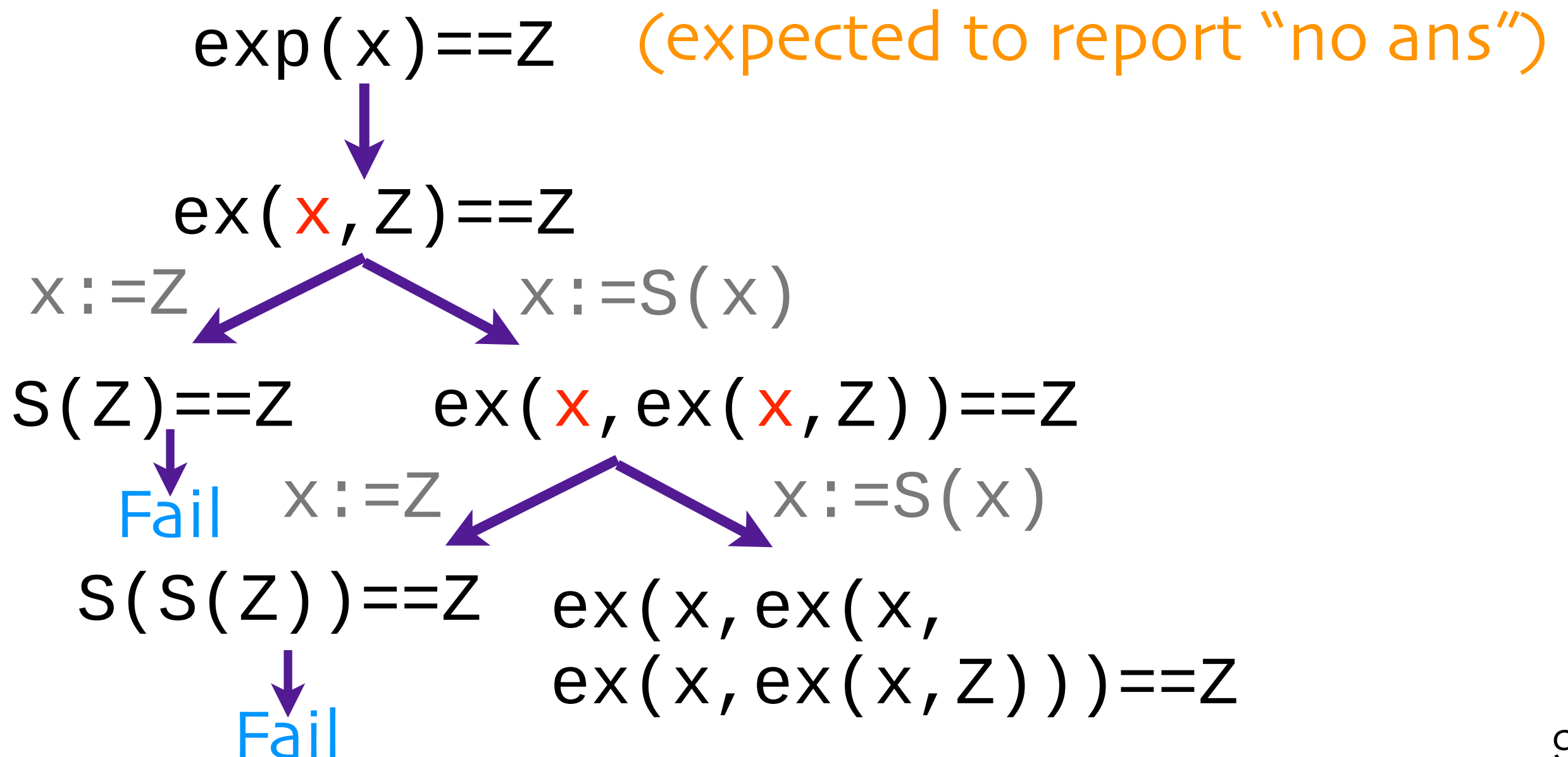
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Problem

$$\begin{aligned}\text{exp}(x) &= \text{ex}(x, Z) \\ \text{ex}(Z, y) &= S(y) \\ \text{ex}(S(x), y) &= \text{ex}(x, \text{ex}(x, y))\end{aligned}$$

$$\text{ex}(x, Z) == Z$$

$x := S(x)$

$$\text{ex}(x, \text{ex}(x, Z)) == Z$$

The check size gets bigger & bigger

$x := S(x)$

$$\text{ex}(x, \text{ex}(x, \text{ex}(x, \text{ex}(x, Z)))) == Z$$

accumulation

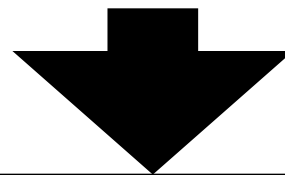
- **Accumulations** cause the size increase of equivalence checks
- **Multiple data traversals** bring in-term dependency

Our Contribution

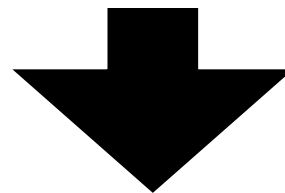
- ▶ An inverse computation method
 - targets parameter-linear Macro-Tree Transducers (MTTs)
 - **Accumulations**
 - **Multiple Data Traversals**
 - terminates in polynomial-time
 - Idea: transformation of a program in the class to a **linear non-accumulative context-generating** program

Our Method

A Param-Linear MTT Prog



Non-Accumulative
Context-Generating Prog



Linear Non-Accumulative
Context-Generating Tupled Prog



An Output

Narrowing-based
Inv-comp
(memoized)

Inputs

Target Language

A Param-Linear MTT Prog

Non-Accumulative
Context-Generating Prog

Linear Non-Accumulative
Context-Generating Tupled Prog

An Output

Narrowing-based
Inv-comp
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Inputs

Language: MTT (1/2)

► (stay) macro-tree transducers (MTT):

- A first-order FP language where ...

- **inputs** can only be destructured
- **outputs** cannot be destructured
- a function takes one **input** and multiple **outputs**

$$\begin{aligned} \text{exp}(\mathbf{x}) &= \text{ex}(\mathbf{x}, \mathbf{Z}) \\ \text{ex}(\mathbf{Z}, \mathbf{y}) &= \mathbf{S}(\mathbf{y}) \\ \text{ex}(\mathbf{S}(\mathbf{x}), \mathbf{y}) &= \text{ex}(\mathbf{x}, \text{ex}(\mathbf{x}, \mathbf{y})) \end{aligned}$$

Language: MTT (2/2)

► (stay) macro-tree transducers (MTT):

- A first-order FP language where ...

- **inputs** can only be destructured
- **outputs** cannot be destructured
- a function takes one **input** and multiple **outputs**

$prog ::= rule_1, \dots, rule_n$

$rule ::= f(p, y_1, \dots, y_m) = e$

$p ::= C(x_1, \dots, x_n) \mid x$

$e ::= C(e_1, \dots, e_n) \mid y \mid f(x, e_1, \dots, e_m)$

[Engelfriet&Vogler 85]

Parameter Linear MTT

- An MTT such that
- each **parameter** is used **exactly once**
 - **parameter**: a variable bind **outputs**

OK

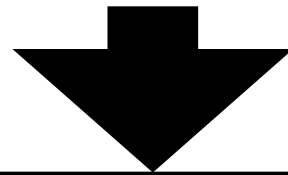
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NG

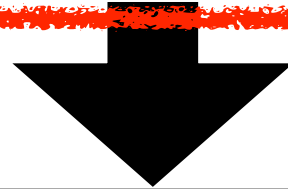
$$\begin{aligned}\text{completeBinT}(\mathbf{x}) &= \text{cb}(\mathbf{x}, L) \\ \text{cb}(\mathbf{Z}, \mathbf{y}) &= \mathbf{y} \\ \text{cb}(S(\mathbf{x}), \mathbf{y}) &= \text{cb}(\mathbf{x}, N(\mathbf{y}, \mathbf{y}))\end{aligned}$$

Elimination of Acc

A Param-Linear MTT Prog



Non-Accumulative
Context-Generating Prog



Linear Non-Accumulative
Context-Generating Tupled Prog



An Output



Narrowing-based
Inv-comp
(memoized)



Inputs

Key Observation

- In MTT, outputs cannot be destructed
→ they appear in the result as-is

$$\begin{aligned} \text{e.g.: } \text{ex}(S(Z), Z) &= S(S(Z)) \\ \text{ex}(S(Z), S(Z)) &= S(S(S(Z))) \end{aligned}$$

context: tree w/ holes

$$\text{ex}(S(Z), \bullet) = S(S(\bullet))$$

$$\begin{aligned} \text{ex}(Z, y) &= S(y) \\ \text{ex}(S(x), y) &= \text{ex}(x, \text{ex}(x, y)) \end{aligned}$$

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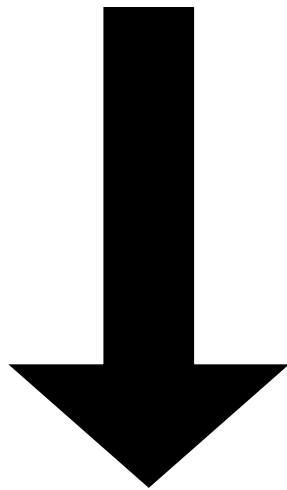
An MTT generates contexts rather than trees

$$\begin{aligned} \text{ex}(Z, y) &= S(y) \\ \text{ex}(S(x), y) &= \text{ex}(x, \text{ex}(x, y)) \end{aligned}$$

Make it Explicit

► By program transformation

$$\begin{aligned}\text{exp}(x) &= \text{ex}(x, Z) \\ \text{ex}(Z, y) &= S(y) \\ \text{ex}(S(x), y) &= \text{ex}(x, \text{ex}(x, y))\end{aligned}$$



replace f with f_c where
 $f_c(x) = f(x, \bullet_1, \dots, \bullet_m)$

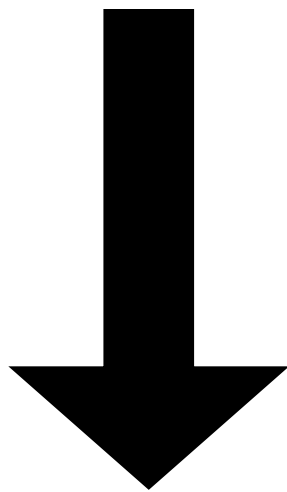


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$\text{exp}(x) = \text{ex}(x, Z)$
 $\text{ex}(Z, y) = S(y)$
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$\text{exp}(x) = \text{ex}(x, \bullet)[Z]$



replace f with f_c where
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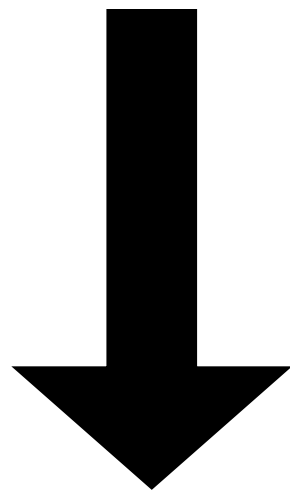


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replace f with f_c where
 $f_c(\mathbf{x}) = f(\mathbf{x}, \bullet_1, \dots, \bullet_m)$

$$\text{exp}_c(\mathbf{x}) = k[Z] \text{ where } k = \text{ex}_c(\mathbf{x})$$

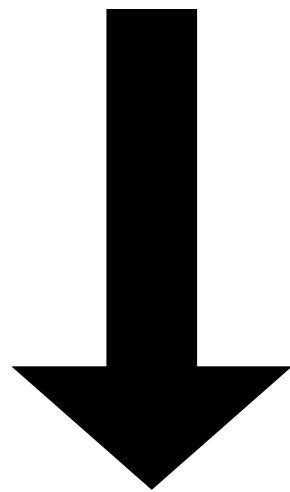
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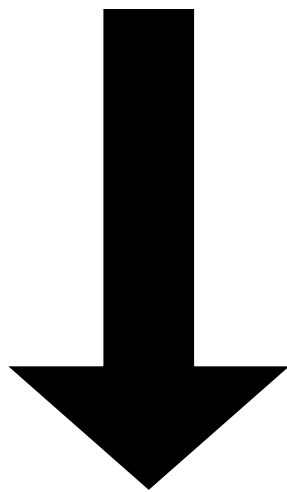
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$$\text{exp}(\mathbf{x}) = \text{ex}(\mathbf{x}, \bullet)[\mathbf{Z}]$$

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replace f with f_c where
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$$\text{exp}(x) = \text{ex}(x, \bullet)[Z]$$

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replace f with f_c where
 $f_c(x) = f(x, \bullet_1, \dots, \bullet_m)$

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

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► By program transformation

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replace f with f_c where

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No Accumulations!

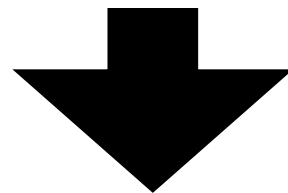
$$\begin{aligned}\text{exp}_c(\mathbf{x}) &= k[\mathbf{Z}] \text{ where } k = \text{ex}_c(\mathbf{x}) \\ \text{ex}_c(\mathbf{Z}) &= \mathbf{S}(\bullet) \\ \text{ex}_c(\mathbf{S}(\mathbf{x})) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(\mathbf{x})\end{aligned}$$

Elimination of MDT

A Param-Linear MTT Prog



Non-Accumulative
Context-Generating Prog



Linear Non-Accumulative
Context-Generating Tupled Prog



An Output



Narrowing-based
Inv-comp
(memoized)



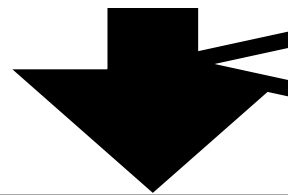
Inputs

Just Apply Tupling

A Param-Linear



Non-Accum
Context-Generating



Linear Non-Accum
Context-Generating

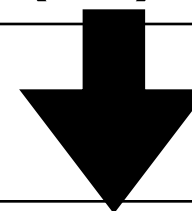


An Output



Narrowing-
Inv-con
(memoiz)

Tupling eliminates
multiple data traversals
[Hu+97, Chin+93,06]!

$$\begin{aligned} h(x) &= \dots f(x) \dots g(x) \dots \\ f(x) &= \dots \\ g(x) &= \dots \end{aligned}$$

$$fg(x) = (f(x), g(x))$$
$$\begin{aligned} h(x) &= \dots s \dots t \dots \\ &\text{where } (s, t) = fg(x) \\ fg(x) &= \dots \end{aligned}$$

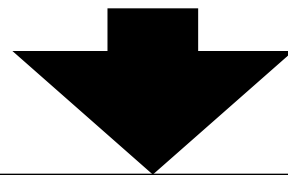
After Tupling

- ▶ Tupling always succeeds,
resulting in a **linear non-accumulative
context-generating** program
 - **no** multiple data traversals
 - **no** accumulations
 - **no problems** on the inv-comp

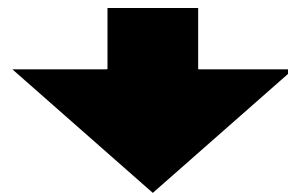
Now, we can apply the existing
narrowing-based inv-comp method!!

(Memoized) Inv-Comp

A Param-Linear MTT Prog



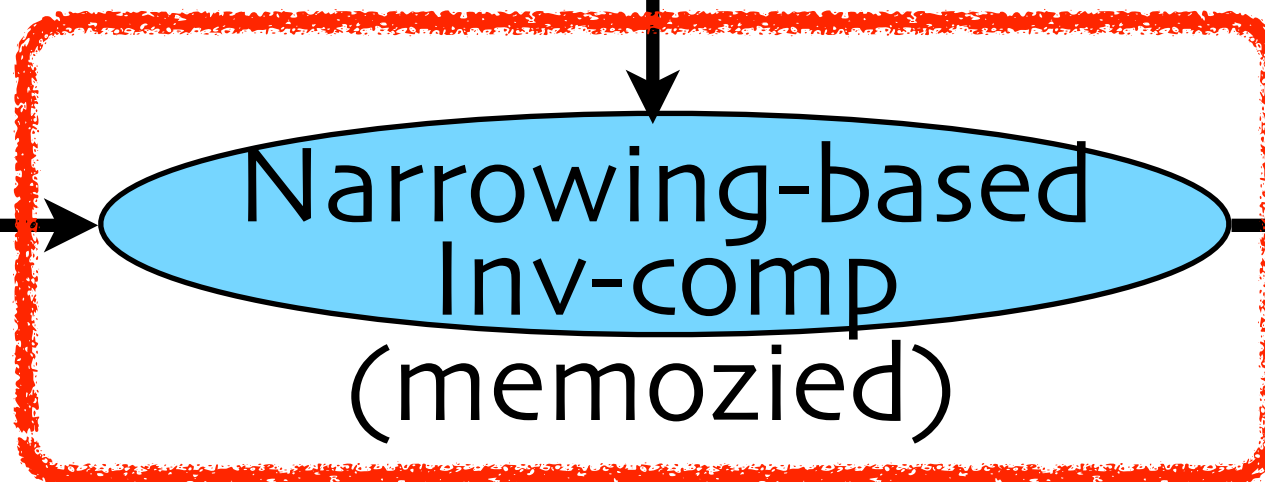
Non-Accumulative
Context-Generating Prog



Linear Non-Accumulative
Context-Generating Tupled Prog



An Output



Narrowing-based
Inv-comp
(memoized)

Inputs

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\text{exp}_c(x) == S(S(Z))$$

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\text{exp}_c(x) == S(S(Z))$$



Example

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$$\text{exp}_c(x) == S(S(Z))$$

$k[Z]$
 $== S(S(Z))$
where
 $k = \text{ex}_c(x)$



Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == S(S(Z))$$

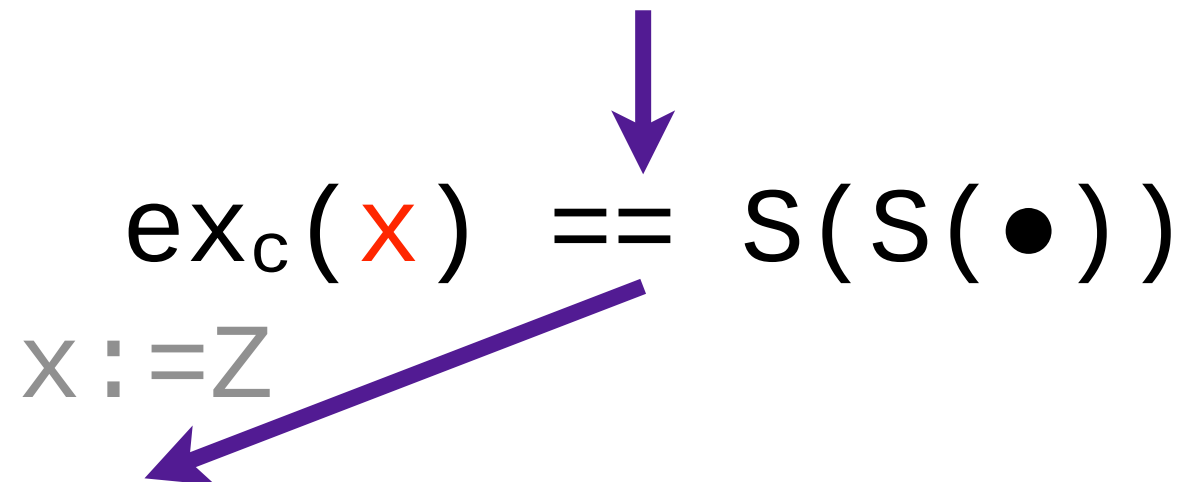
$$\begin{aligned} k[Z] \\ == S(S(Z)) \\ \text{where} \\ k = \text{ex}_c(x) \end{aligned}$$

$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\text{exp}_c(x) == S(S(Z))$$


$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$

$x := Z$

Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == S(S(Z))$$



$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$

$x := Z$

$$\begin{aligned} S(\bullet) \\ == S(S(\bullet)) \end{aligned}$$

Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == S(S(Z))$$



$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$

$x := Z$

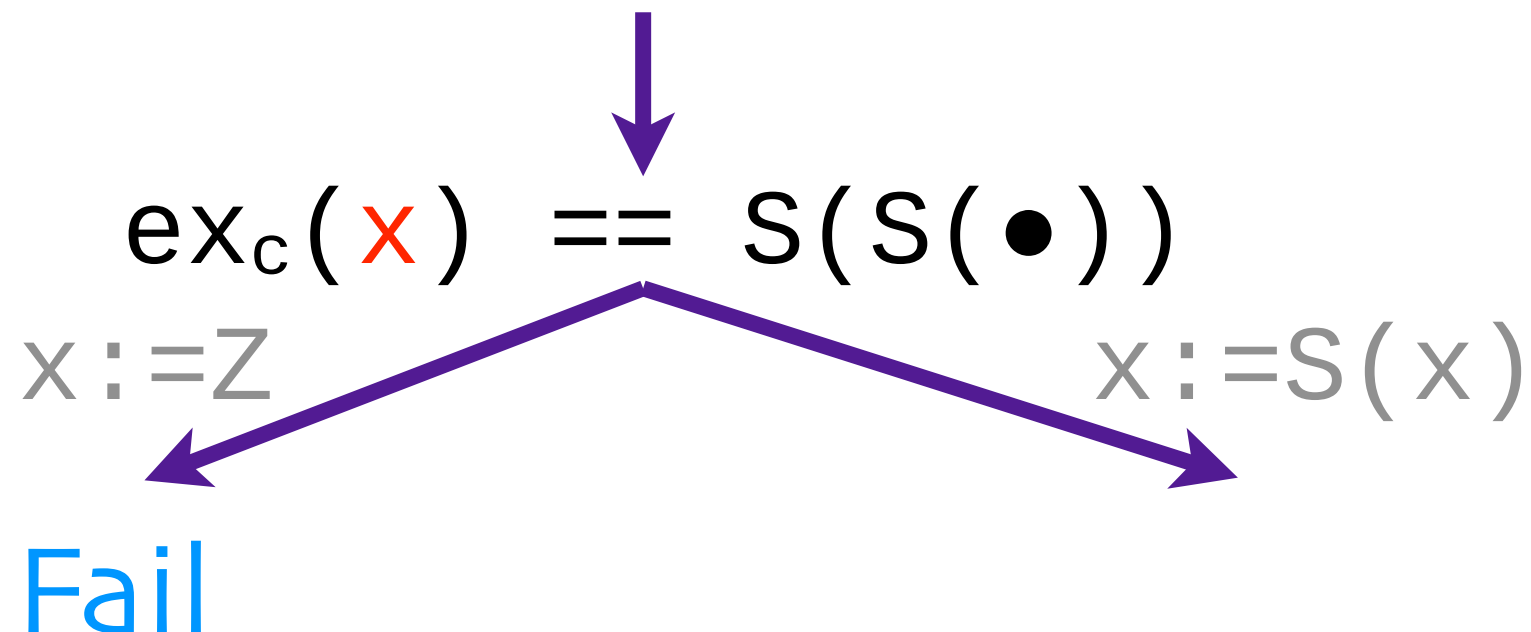
Fail

$$\begin{aligned} S(\bullet) \\ == S(S(\bullet)) \end{aligned}$$

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\text{exp}_c(x) == S(S(Z))$$



Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == S(S(Z))$$

$$\begin{aligned} &k[k[\bullet]] \\ &== S(S(\bullet)) \\ &\text{where} \\ &k = \text{ex}_c(x) \end{aligned}$$

$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$

$x := 7$

$x := S(x)$

Fail

Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == S(S(Z))$$

$$\begin{aligned} &k[k[\bullet]] \\ &== S(S(\bullet)) \\ &\text{where} \\ &k = \text{ex}_c(x) \end{aligned}$$

$$\text{ex}_c(x) == S(S(\bullet))$$

$x := Z$

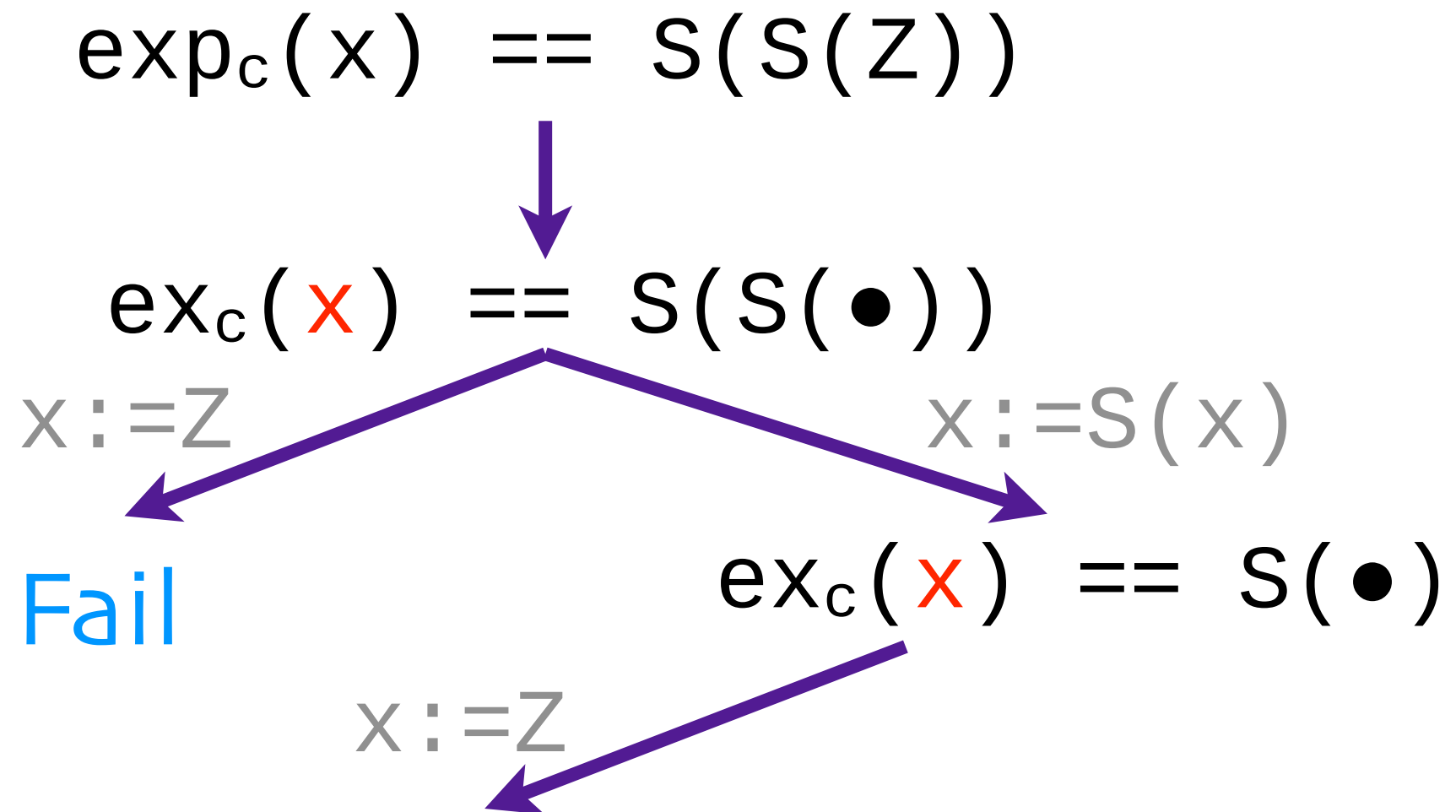
$x := S(x)$

Fail

$$\text{ex}_c(x) == S(\bullet)$$

Example

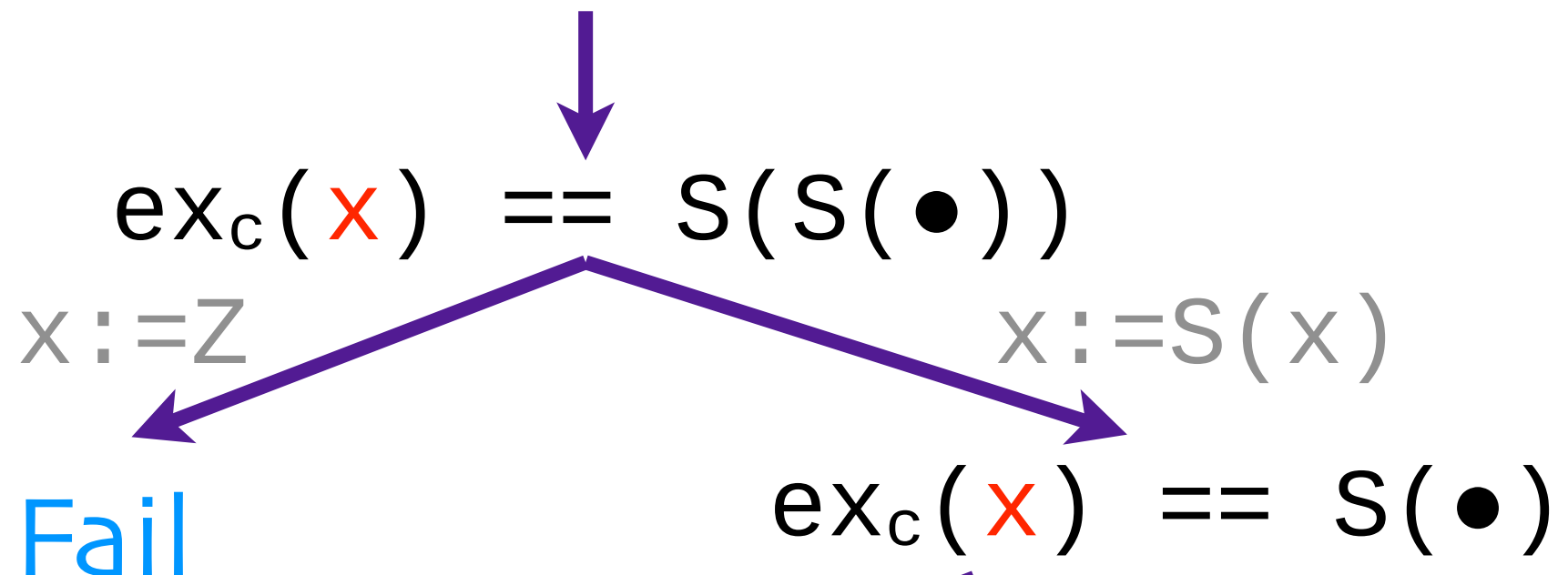
$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$



Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\text{exp}_c(x) == S(S(Z))$$

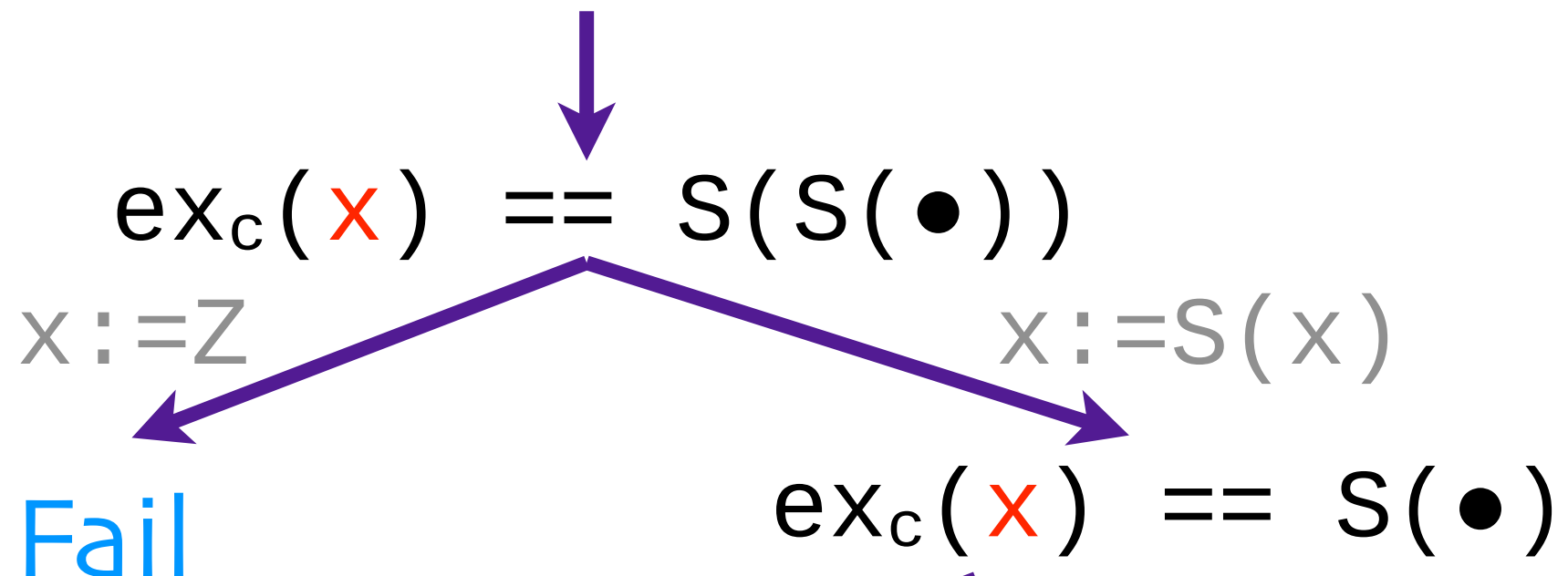


$$\begin{array}{l} S(\bullet) \\ == S(\bullet) \end{array}$$

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

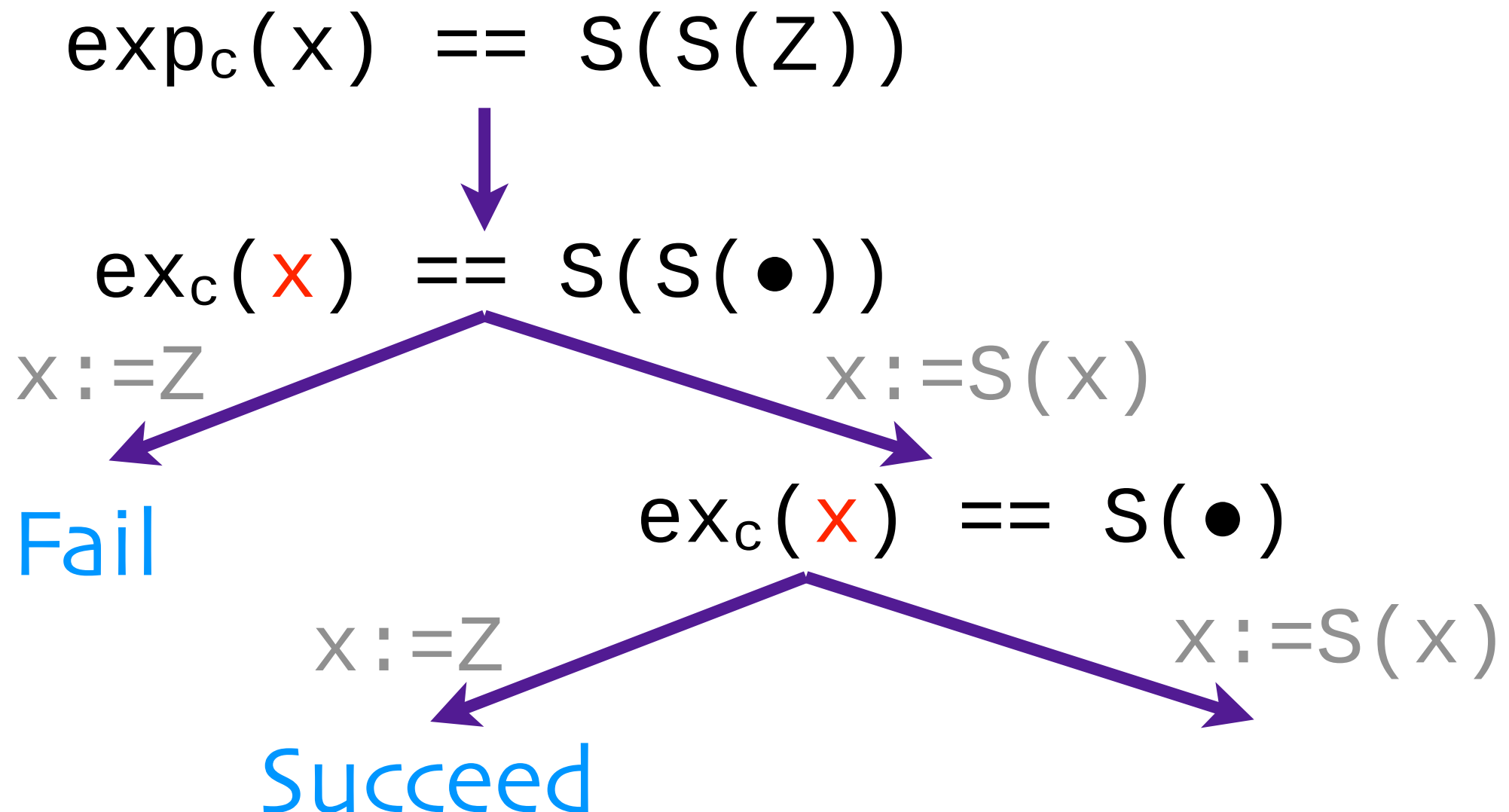
$$\text{exp}_c(x) == S(S(Z))$$



$$\begin{array}{l} S(\bullet) \\ == S(\bullet) \end{array}$$

Example

$\text{exp}_c(x)$	$= k[Z]$	where $k = \text{ex}_c(x)$
$\text{ex}_c(Z)$	$= S(\bullet)$	
$\text{ex}_c(S(x))$	$= k[k[\bullet]]$	where $k = \text{ex}_c(x)$



Example

$\text{exp}_c(x) = k[Z] \text{ where } k = \text{ex}_c(x)$
 $\text{ex}_c(Z) = S(\bullet)$
 $\text{ex}_c(S(x)) = k[k[\bullet]] \text{ where } k = \text{ex}_c(x)$

$\text{exp}_c(x) == S(S(Z))$

$\text{ex}_c(x) == S(S(\bullet))$

$x := Z$

$x := S(x)$

Fail

$\text{ex}_c(x) == S(\bullet)$

$x := Z$

$x := S(x)$

Succeed

$k[k[\bullet]]$
 $== S(\bullet)$
where
 $k = \text{ex}_c(x)$

Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == S(S(Z))$$

$$\text{ex}_c(x) == S(S(\bullet))$$

$x := Z$

Fail

$x := S(x)$

$$\text{ex}_c(x) == S(\bullet)$$

$x := Z$

Succeed

$x := S(x)$

Fail

$k[k[\bullet]]$
 $== S(\bullet)$
where
 $k = \text{ex}_c(x)$

Example

$$\begin{array}{lcl} \exp_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\exp_c(x) == Z$$

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

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Example

$$\begin{aligned} \exp_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\exp_c(x) == Z$$

$k[Z]$

$== Z$

where

$k = \text{ex}_c(x)$



Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == Z$$

$$\text{ex}_c(\textcolor{red}{x}) == \bullet$$

$k[Z]$

$== Z$

where

$k = \text{ex}_c(x)$

Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$

$$\begin{array}{c} \text{exp}_c(x) == Z \\ \downarrow \\ \text{ex}_c(\textcolor{red}{x}) == \bullet \\ \swarrow \text{ } x := Z \end{array}$$

Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == Z$$

$$\text{ex}_c(\textcolor{red}{x}) == \bullet$$

$$S(\bullet) == \bullet$$

$x := Z$

Example

$$\begin{aligned} \text{exp}_c(x) &= k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) &= S(\bullet) \\ \text{ex}_c(S(x)) &= k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{aligned}$$

$$\text{exp}_c(x) == Z$$

$$\text{ex}_c(\textcolor{red}{x}) == \bullet$$

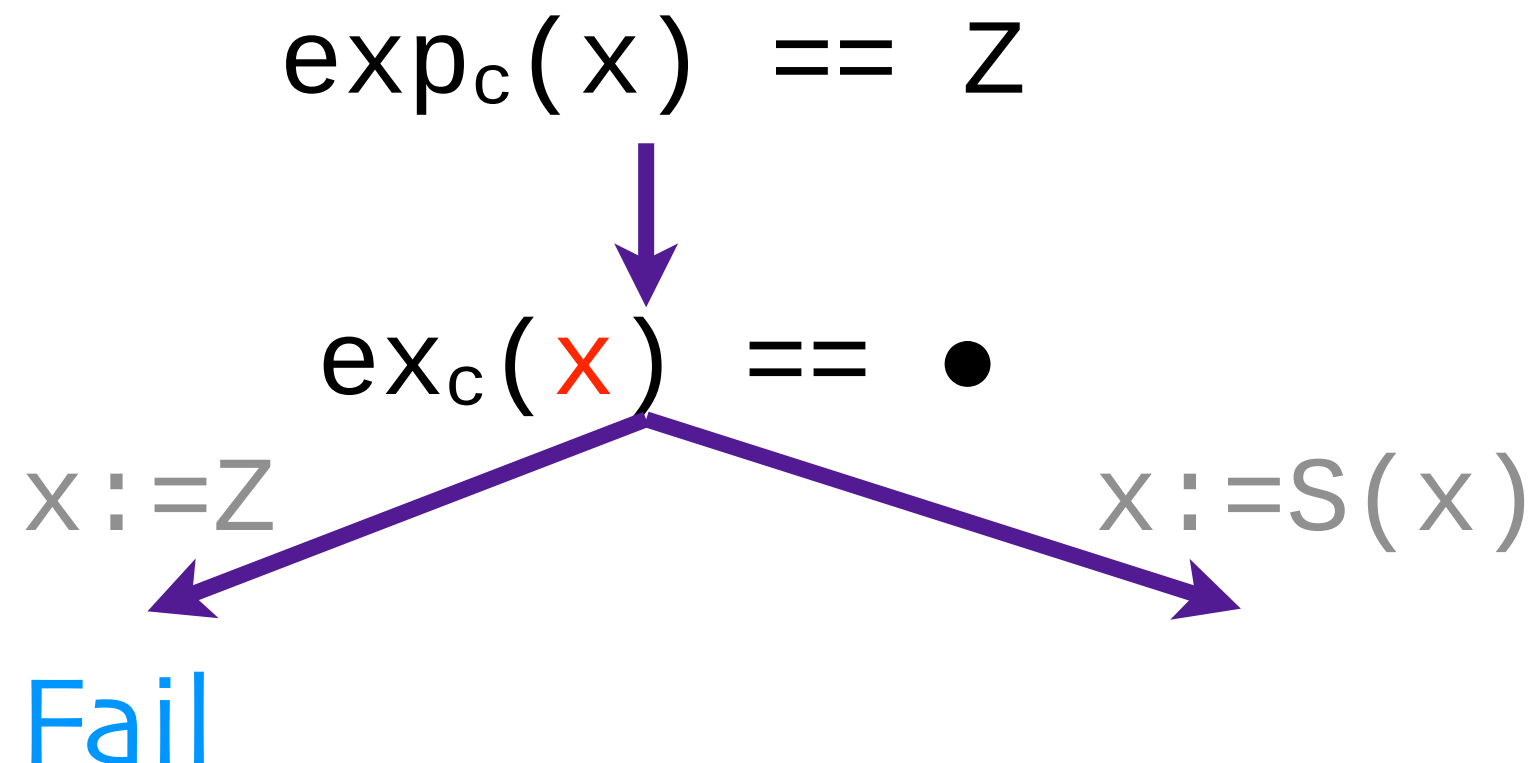
$$S(\bullet) == \bullet$$

$x := Z$

Fail

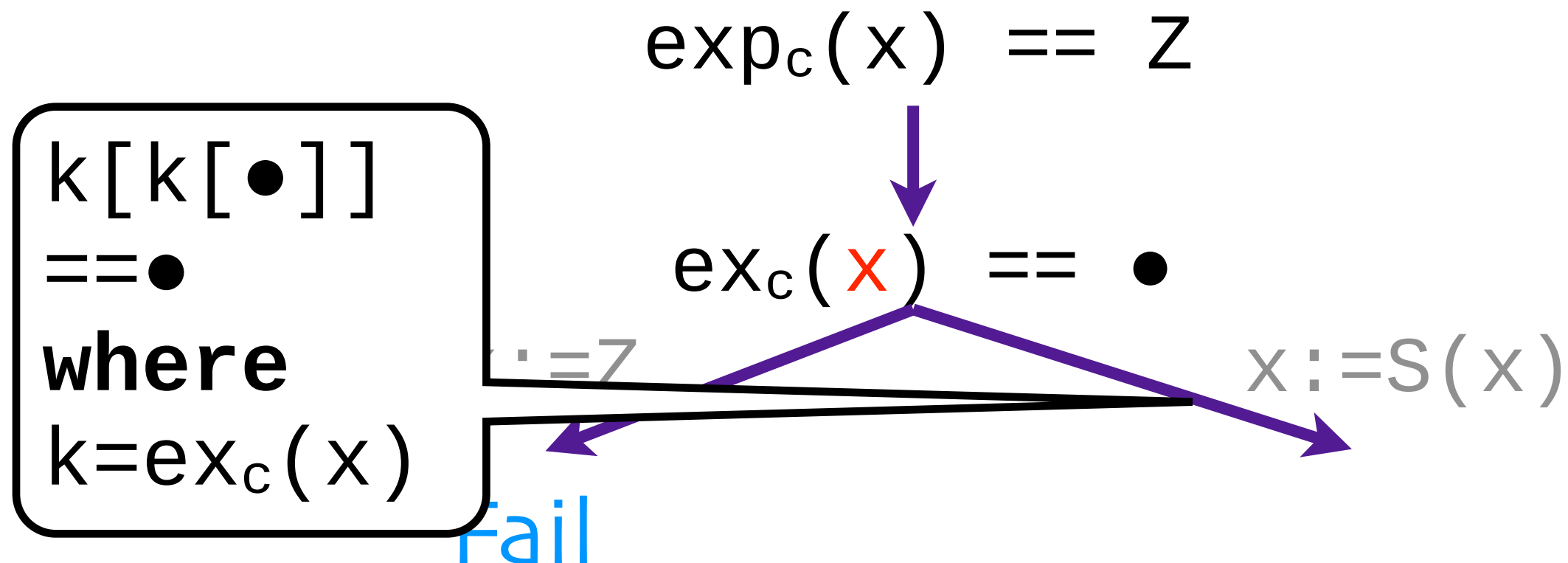
Example

$$\begin{array}{lcl} \text{exp}_c(x) & = & k[Z] \text{ where } k = \text{ex}_c(x) \\ \text{ex}_c(Z) & = & S(\bullet) \\ \text{ex}_c(S(x)) & = & k[k[\bullet]] \text{ where } k = \text{ex}_c(x) \end{array}$$



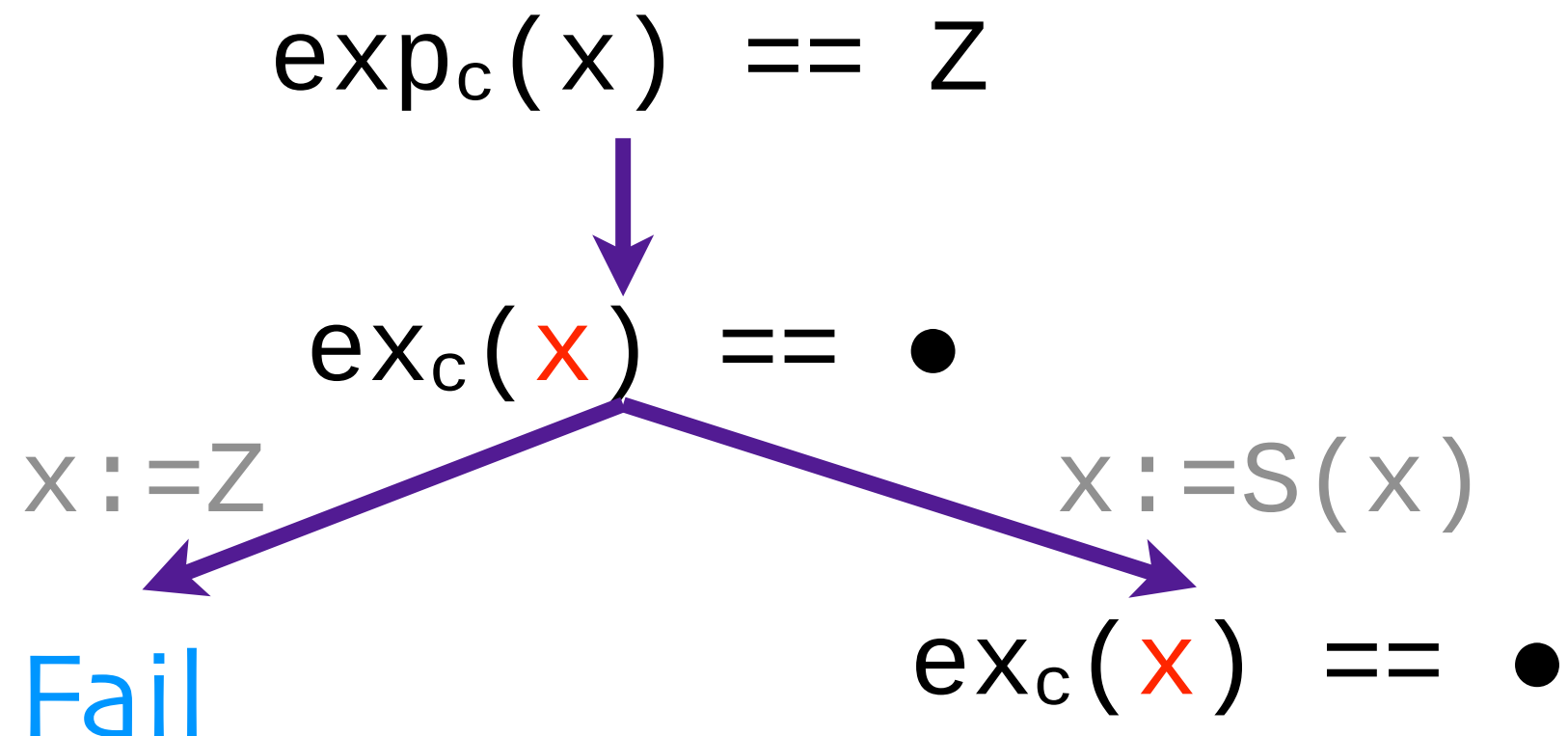
Example

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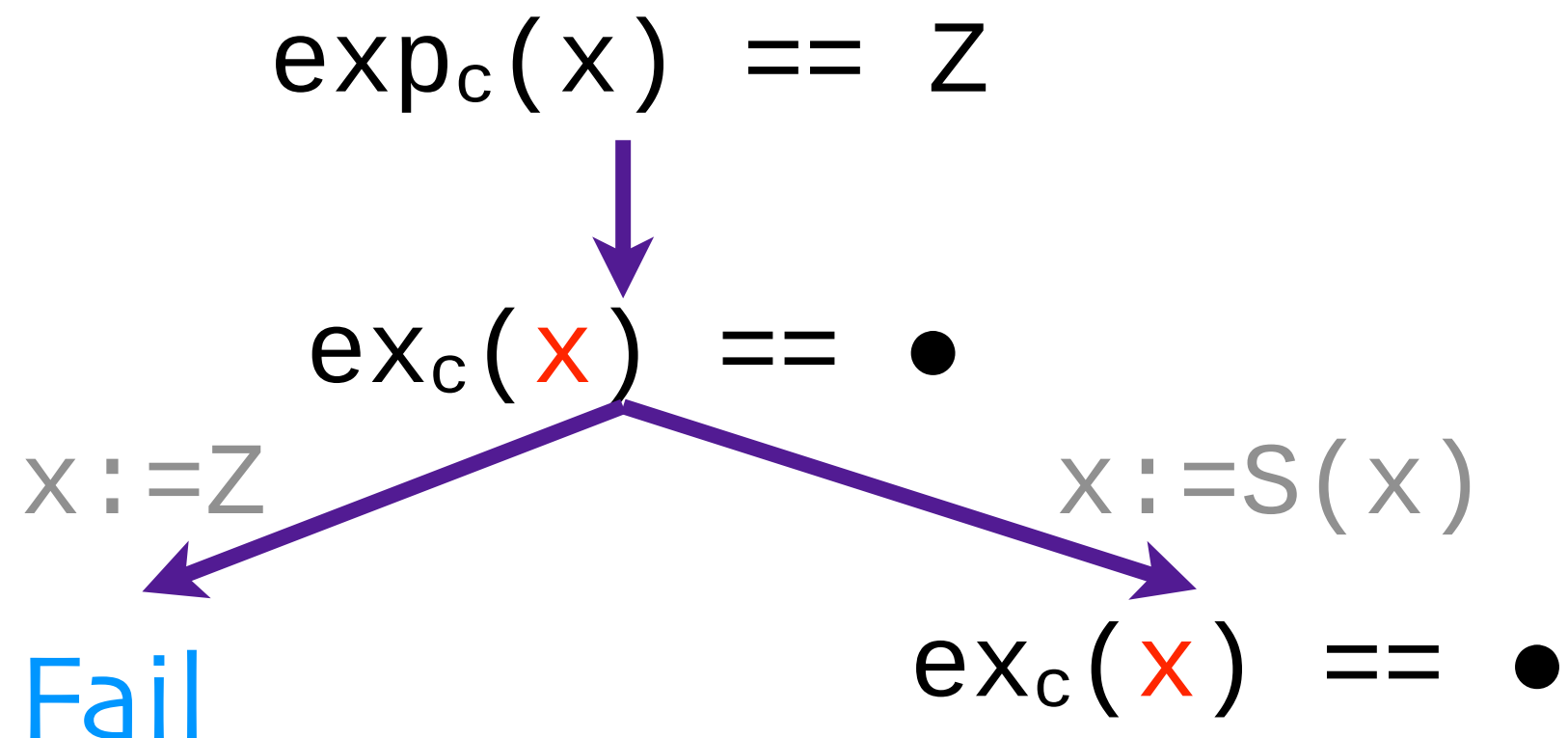
Example

$\text{exp}_c(x)$	$= k[Z]$	where $k = \text{ex}_c(x)$
$\text{ex}_c(Z)$	$= S(\bullet)$	
$\text{ex}_c(S(x))$	$= k[k[\bullet]]$	where $k = \text{ex}_c(x)$



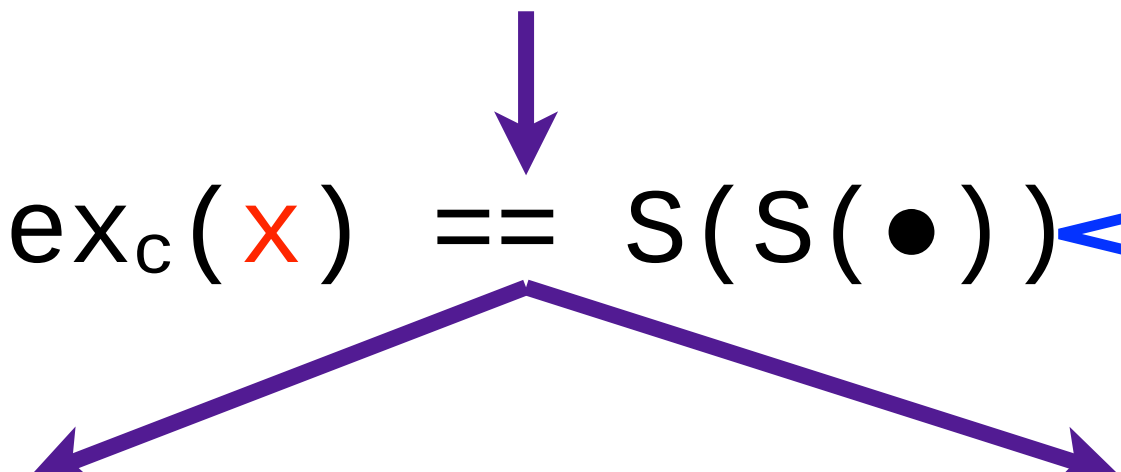
Example

$\text{exp}_c(x)$	$= k[Z]$	where $k = \text{ex}_c(x)$
$\text{ex}_c(Z)$	$= S(\bullet)$	
$\text{ex}_c(S(x))$	$= k[k[\bullet]]$	where $k = \text{ex}_c(x)$



Loop detected by Memoization

Complexity

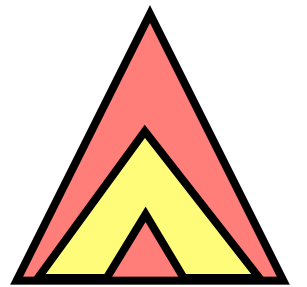
$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$


In general, each eq-chk has the form of:

$$h_c(x) == (K_1, \dots, K_m)$$

from parameter-linearity

Each K_i is a **linear subcontext** of the original output (fed to inverse computation)



$$\Rightarrow \#K = O(n^{\#hole+1}) \leq$$

(n: the size of the original output)

Complexity

$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$

In general, each eq-chk has the form of:

$$h_c(x) == (K_1, \dots, K_m)$$

from parameter-linearity

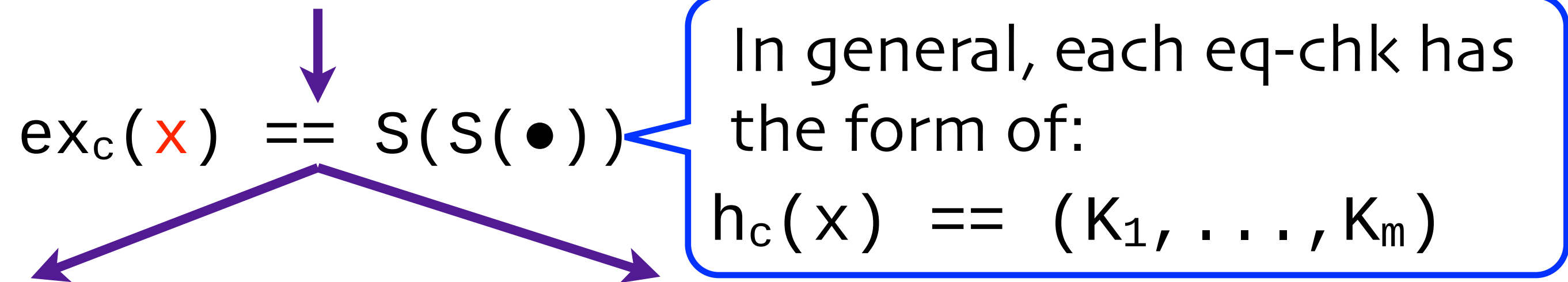
Each K_i is a **linear subcontext** of the original output (fed to it)

$$\text{Recall: } f_c(x) = f(x, \bullet_1, \dots, \bullet_n)$$

$$\Rightarrow \#K = O(n^{\#hole+1}) \leq$$

(n : the size of the original output)

Complexity



from parameter-linearity

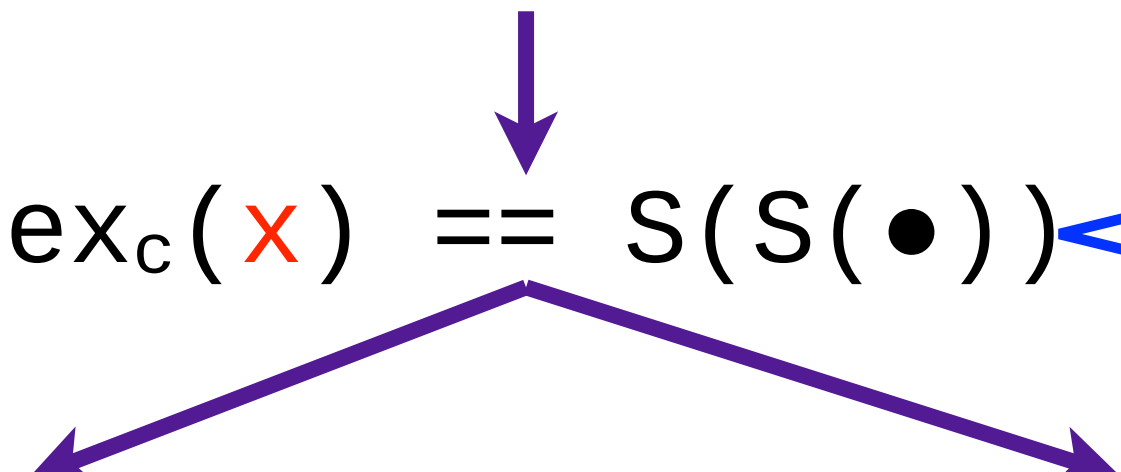
Each K_i is a **linear subcontext** of the original output (fed to it)

Recall: $f_c(x) = f(x, \bullet_1, \dots, \bullet_n)$

$$\Rightarrow \#K = O(n^{\#hole+1}) \leq O(n^{\maxArity})$$

(n : the size of the original output)

Complexity

$$\text{ex}_c(\textcolor{red}{x}) == S(S(\bullet))$$


In general, each eq-chk has the form of:

$$h_c(x) == (K_1, \dots, K_m)$$

from parameter-linearity

Each K_i is a **linear subcontext** of the original output (fed to it)

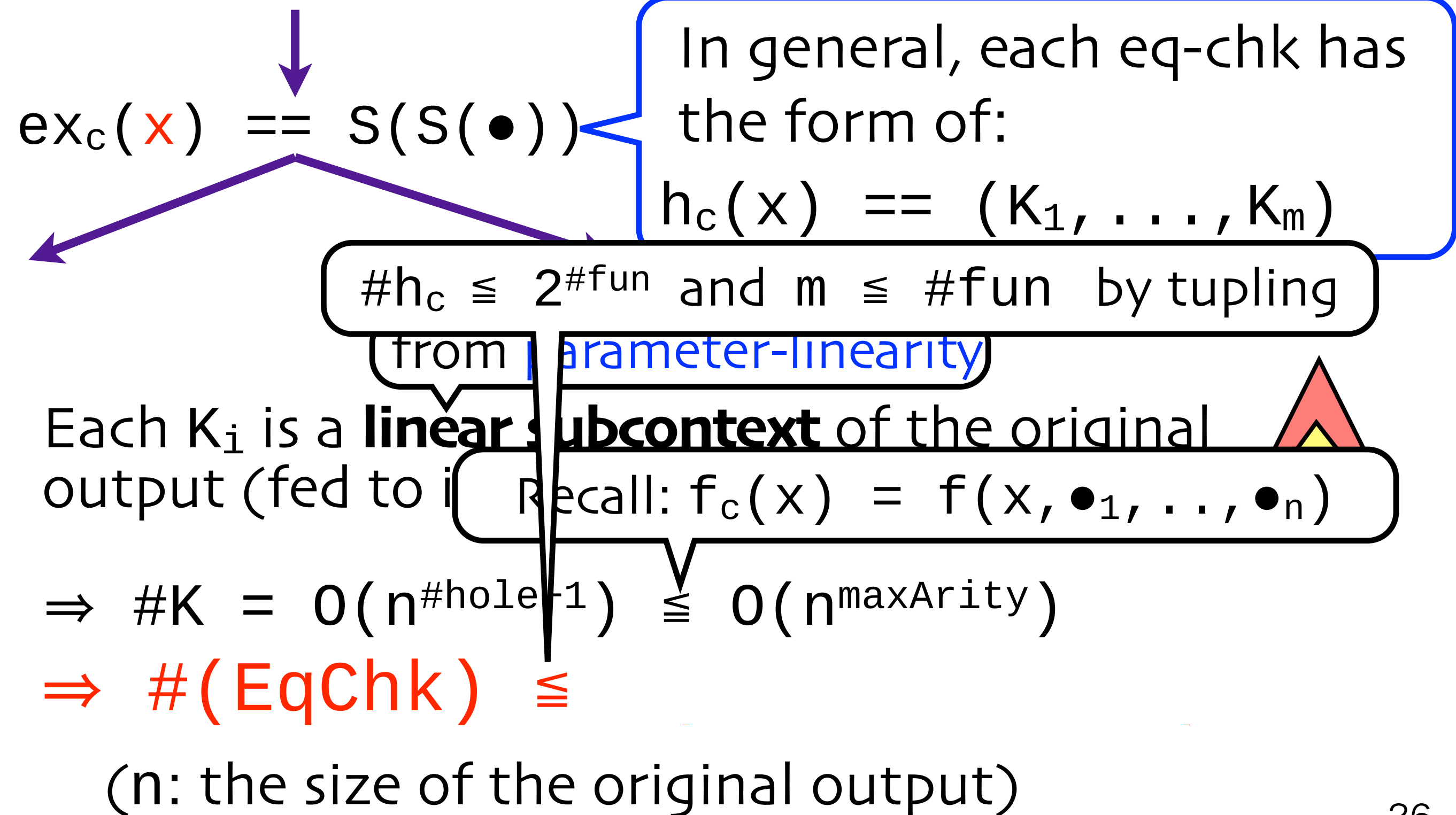
$$\text{Recall: } f_c(x) = f(x, \bullet_1, \dots, \bullet_n)$$

$$\Rightarrow \#K = O(n^{\#hole+1}) \leq O(n^{\maxArity})$$

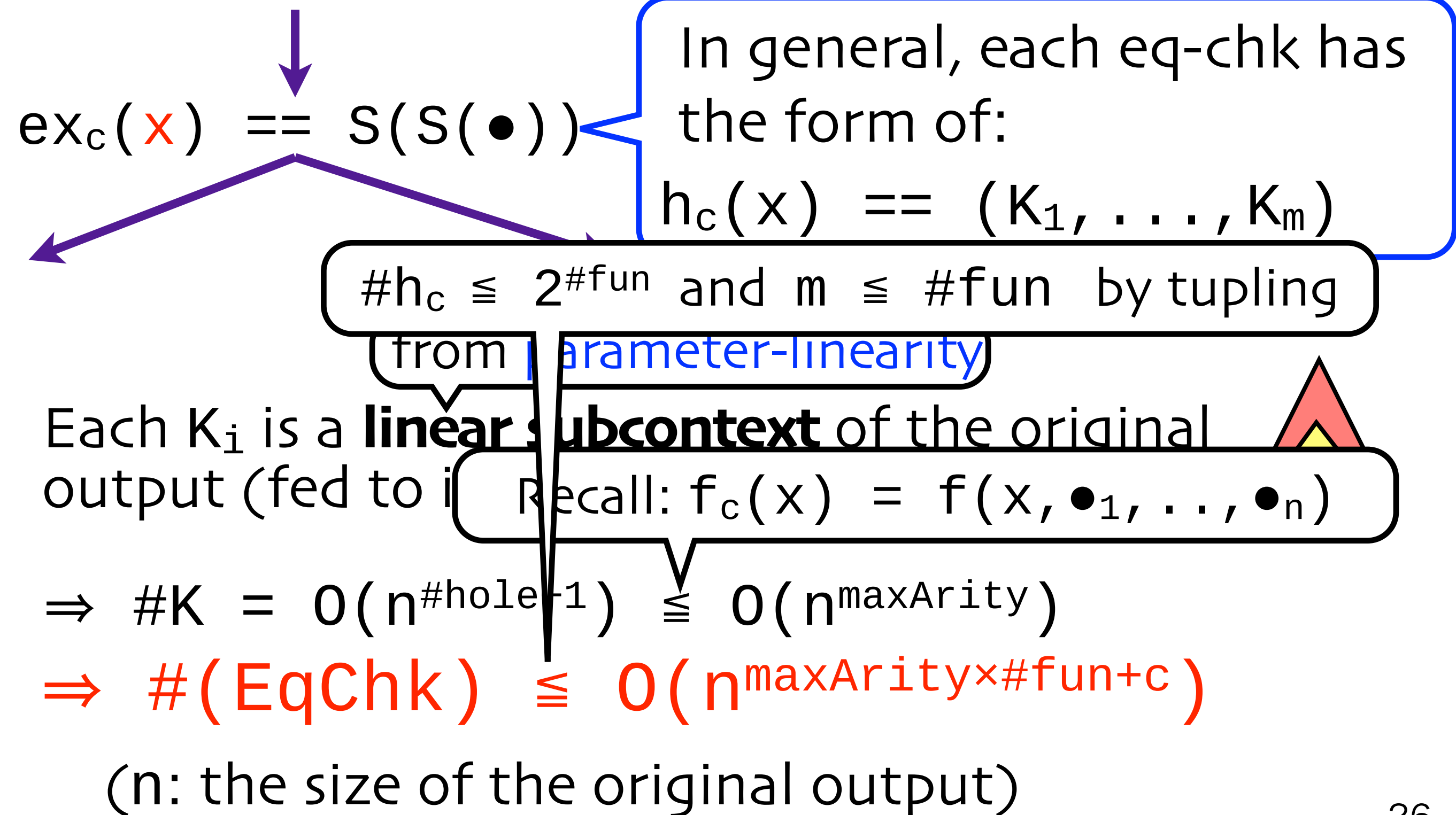
$$\Rightarrow \textcolor{red}{\#(EqChk)} \leq$$

(n: the size of the original output)

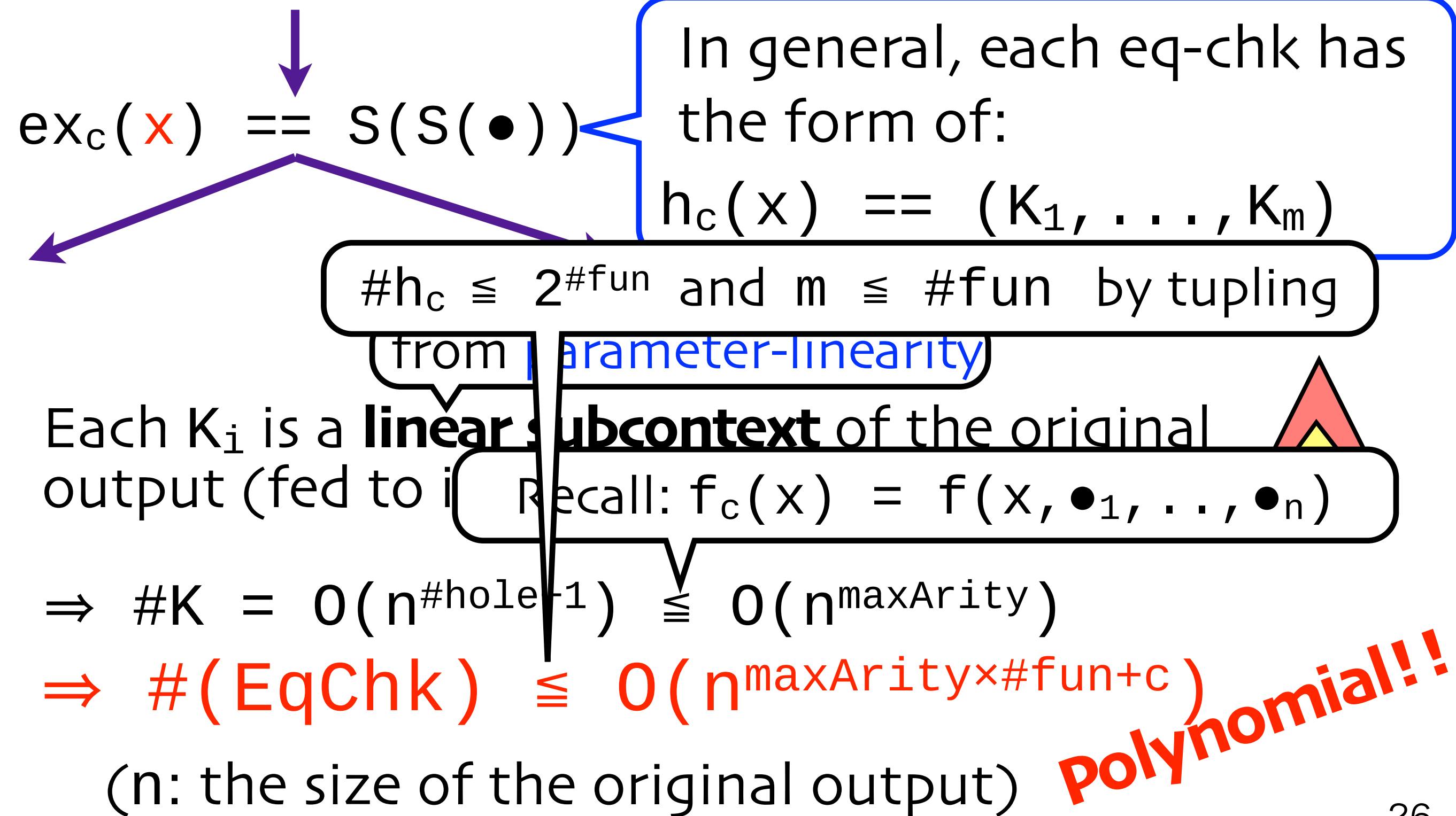
Complexity



Complexity



Complexity



Short Summary

► This talk

- Idea of a polynomial time inverse computation for parameter-linear MTT

► In the paper

- A tree automaton to represent infinite results of (memoized) inv-comp
- Extensions
 - pattern guards
 - bounded parameter copying

Related Work

- ▶ Polynomial-time inverse-image comp for a class of MTT [Frisch&Hosoya 07]
 - Inverse computation is a subproblem of inverse-image computation

	ours	theirs
multiple data traversals	no restriction	bounded
parameter copies	bounded (see paper)	no restriction

See our paper what causes the difference

Related Work

► Polynomial-time inverse-image comp

$\text{exp}(x) = \text{ex}(x, Z)$
 $\text{ex}(Z, y) = S(y)$
 $\text{ex}(S(x), y) = \text{ex}(x, \text{ex}(x, y))$

$\text{completeBinTree}(x) = \text{cb}(x, L)$
 $\text{cb}(Z, y) = y$
 $\text{cb}(S(x), y) = \text{cb}(x, N(y, y))$

inverse-image computation

	ours	theirs
multiple data traversals	no restriction	bounded
parameter copies	bounded (see paper)	no restriction

See our paper what causes the difference

Conclusion

- ▶ An inverse computation method
 - Polynomial-time for parameter-linear Macro-Tree Transducers (MTTs)
 - **Accumulations**
 - **Multiple Data Traversals**
 - Idea: transformation of a program in the class to a **linear non-accumulative context-generating** program

Future Work

1. Range-analysis-based inversion

$\text{rev}([], y) = y$
 $\text{rev}(a:x, y) = \text{rev}(x, a:y)$

Overlap

$\text{rev}([]) = \bullet$
 $\text{rev}(a:x) = k[a:\bullet]$
where $k = \text{rev}(x)$

disjoint

2. More practical copying

- join-like operations in DB query

$$\left[\begin{array}{l} (x, y, z) \mid \\ (x, y) \leftarrow as, (y', z) \leftarrow bs, \\ y == y' \end{array} \right]$$