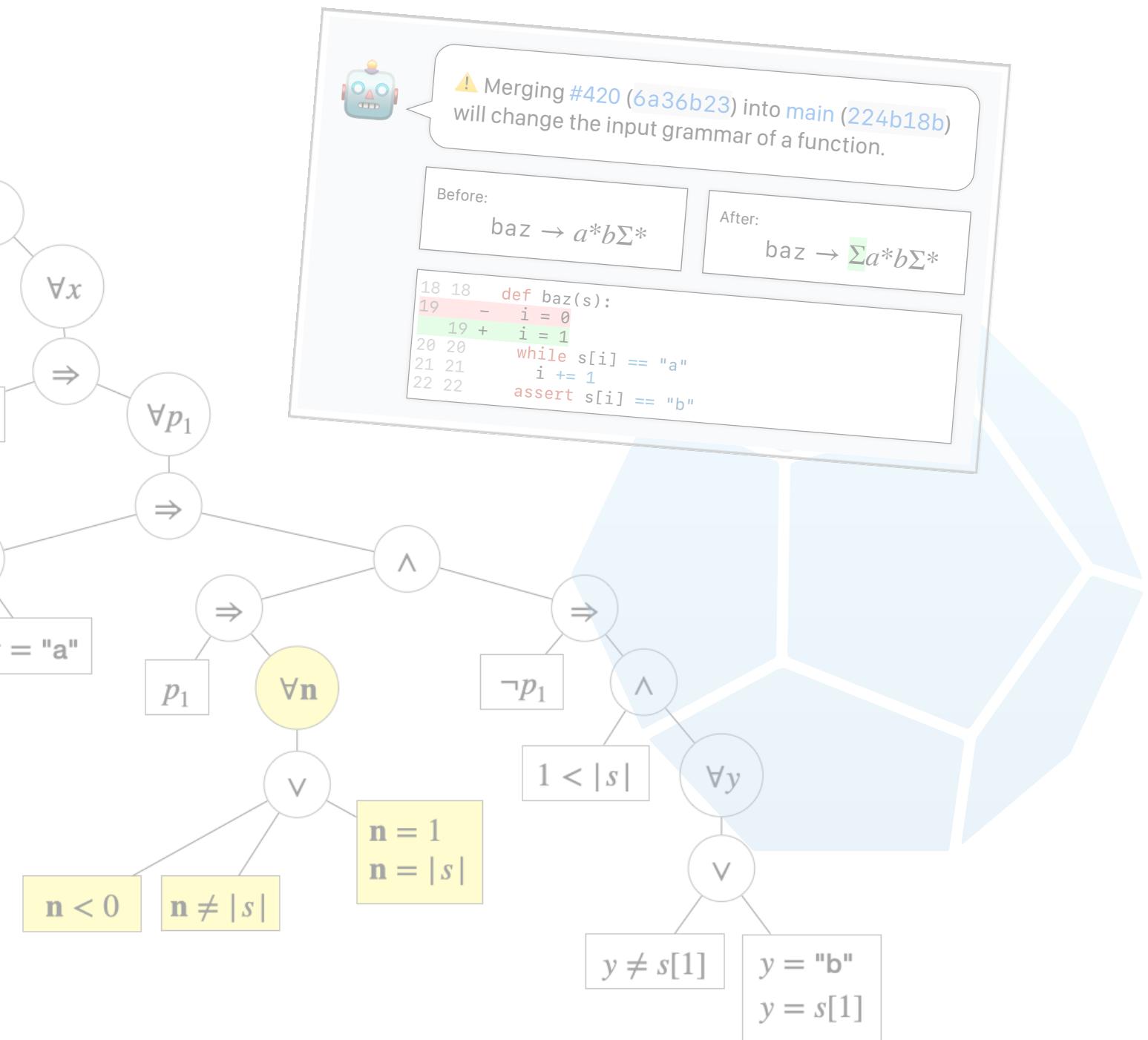


Grammar Inference for Ad Hoc Parsers

<https://mcschroeder.github.io/#splash2022>

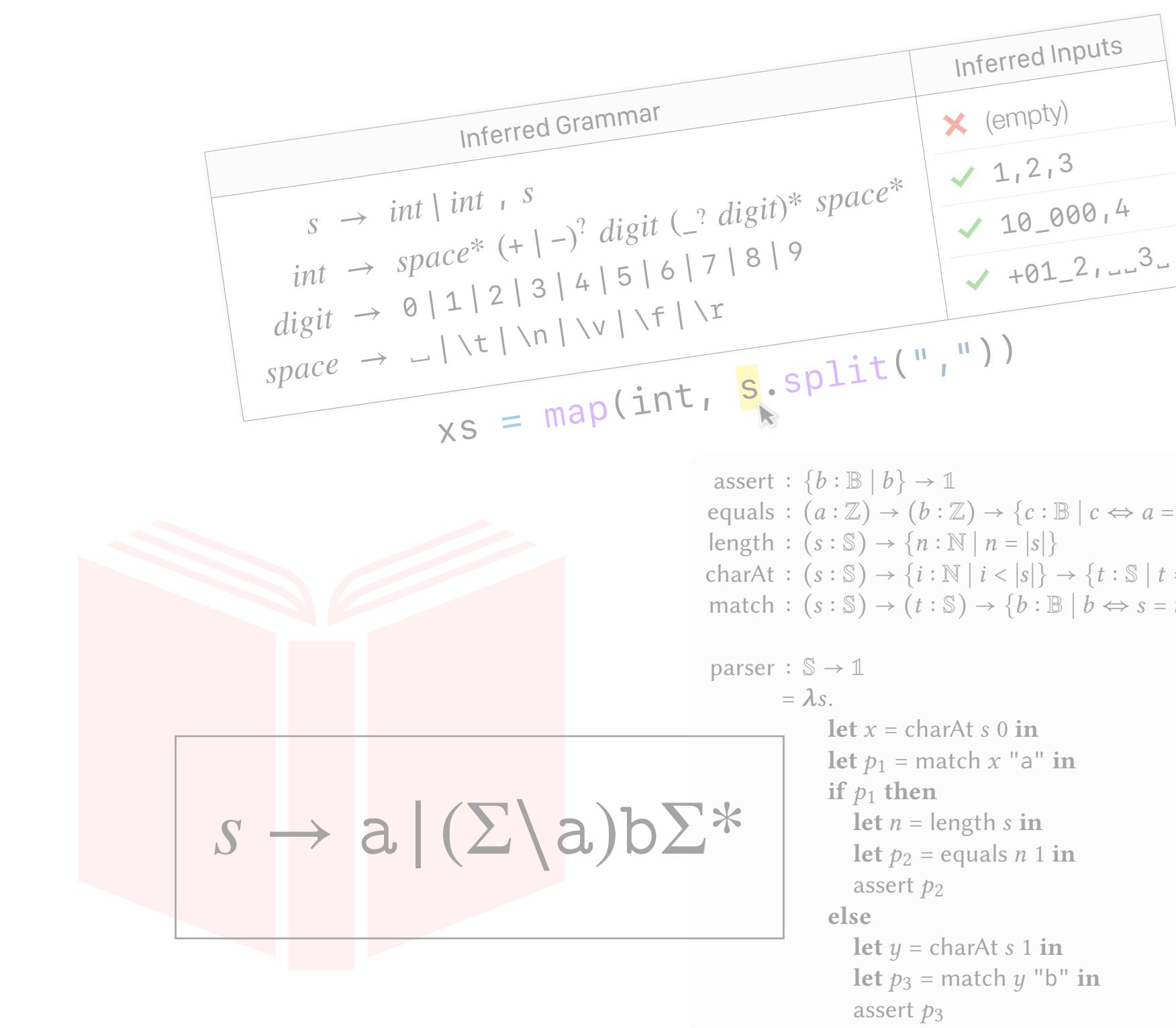


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Doctoral Symposium, SPLASH 2022

Tāmaki Makaurau, Aotearoa
Auckland, New Zealand

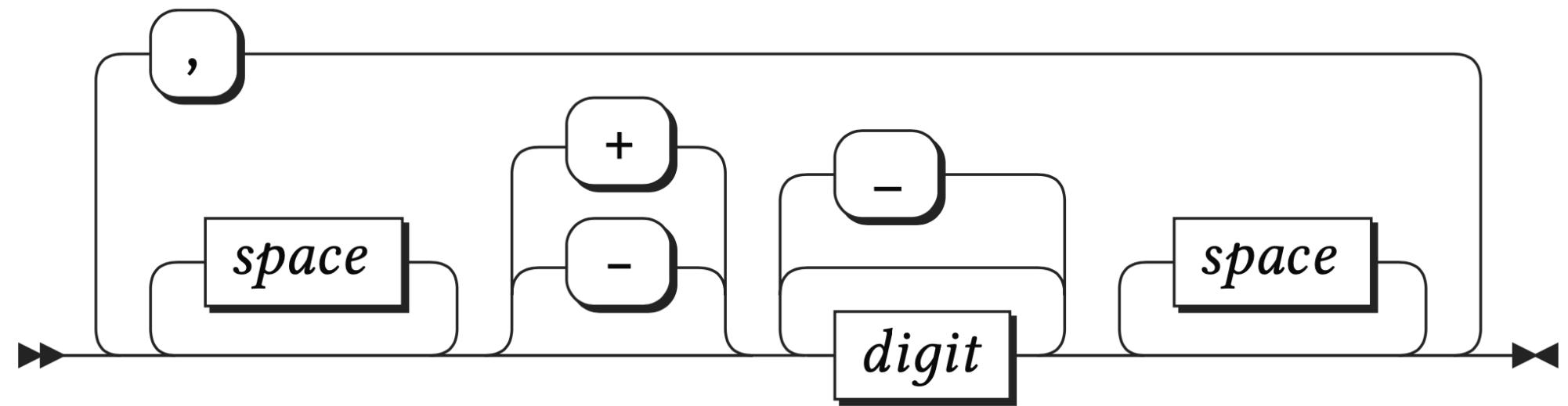


Informatics

```
xs = map(int, s.split(", "))
```

```
xs = map(int, s.split(", "))
```

```
[1,2,3]
```

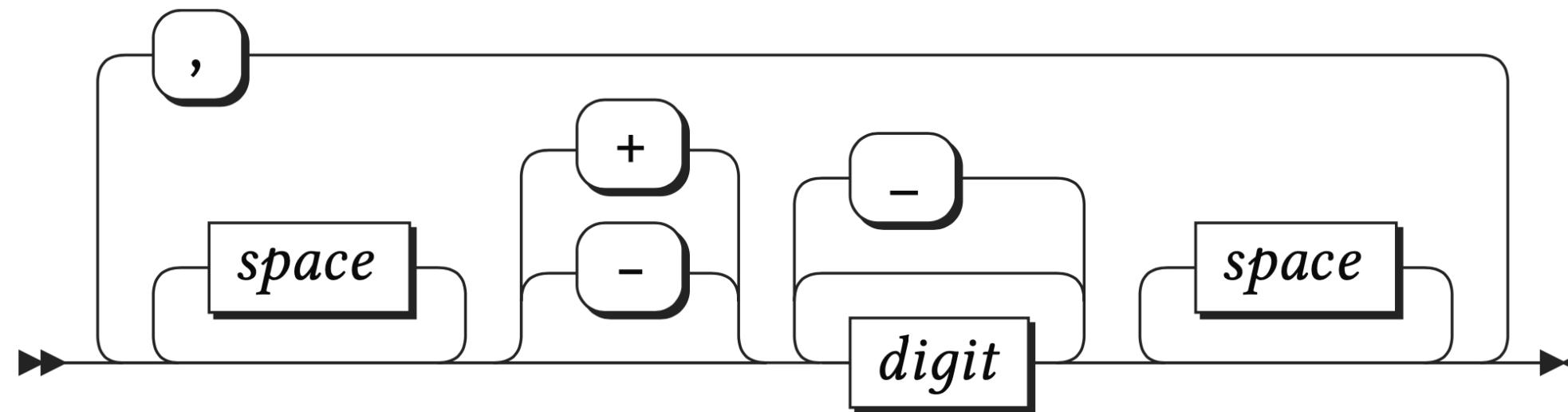


```

 $s \rightarrow int \mid int , s$ 
 $int \rightarrow space^* (+ \mid -)^? digit (_? digit)^* space^*$ 
 $digit \rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9$ 
 $space \rightarrow \_ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r$ 

```

```
xs = map(int, s.split(", "))
```



$$\begin{aligned}
 s &\rightarrow \text{int} \mid \text{int} , \ s \\
 \text{int} &\rightarrow \text{space}^* (+ \mid -)^? \text{digit} (_? \text{digit})^* \text{space}^* \\
 \text{digit} &\rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9 \\
 \text{space} &\rightarrow _ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r
 \end{aligned}$$

```
xs = map(int, s.split(", "))
```

Parser : Grammar \approx Function : Type

Type Inference

```
xs = map(int, s.split(","))
```

[Int] String

```
graph TD; A[Int] --> B["xs = map(int, s.split(",))"]; C[String] --> D[s]
```

Type Inference + Grammar Inference

```
s → int | int , s
int → space* (+ | -)? digit (_? digit)* space*
digit → 0 | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9
space → _ | \t | \n | \v | \f | \r
```

```
xs = map(int, s.split(", "))

[Int]           / 
                String {•}
```

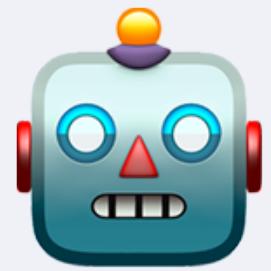
Interactive Documentation



Inferred Grammar	Inferred Inputs
$s \rightarrow int \mid int , s$	✗ (empty)
$int \rightarrow space^* (+ \mid -)^? digit (_? digit)^* space^*$	✓ 1, 2, 3
$digit \rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9$	✓ 10_000, 4
$space \rightarrow _ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r$	✓ +01_2, __3_

```
xs = map(int, s.split(", "))
```

Semantic Change Tracking



⚠ Merging #420 (6a36b23) into main (224b18b)
will change the input grammar of a function.

Before:

$$\text{baz} \rightarrow a^*b\Sigma^*$$

After:

$$\text{baz} \rightarrow \Sigma a^*b\Sigma^*$$

```
18 18    def baz(s):
19  -      i = 0
19  +      i = 1
20 20      while s[i] == "a"
21 21          i += 1
22 22      assert s[i] == "b"
```

Applications

- interactive documentation
- semantic change tracking
- grammar-aware refactoring
- parser sketching
- searching for parsers using their grammar
- detecting parser code clones
- grammar-based fuzzing
- ...

Inferred Grammar	Inferred Inputs
$s \rightarrow \text{int} \mid \text{int}, s$	✗ (empty)
$\text{int} \rightarrow \text{space}^* (+ \mid -)? \text{digit} (_? \text{digit})^* \text{space}^*$	✓ 1, 2, 3
$\text{digit} \rightarrow 0 \mid 1 \mid 2 \mid 3 \mid 4 \mid 5 \mid 6 \mid 7 \mid 8 \mid 9$	✓ 10_000, 4
$\text{space} \rightarrow _ \mid \backslash t \mid \backslash n \mid \backslash v \mid \backslash f \mid \backslash r$	✓ +01_2, __3_

```
xs = map(int, s.split(", "))
```

A screenshot of a software interface. At the top, there is a warning message from a robot icon: "⚠️ Merging #420 (6a36b23) into main (224b18b) will change the input grammar of a function." Below this, there are two boxes labeled "Before:" and "After:". The "Before" box shows the grammar rule $\text{baz} \rightarrow a^* b \Sigma^*$. The "After" box shows the grammar rule $\text{baz} \rightarrow \Sigma a^* b \Sigma^*$. At the bottom, there is a code editor window showing Python code with line numbers and some lines highlighted in red and green.

```
18 18 def baz(s):
19   - i = 0
20   + i = 1
21   20 while s[i] == "a"
22   21 i += 1
22   22 assert s[i] == "b"
```

✨ Automatic Grammar Inference ✨

ad hoc parser source

```
def parser(s):
    if s[0] == "a":
        assert len(s) == 1
    else:
        assert s[1] == "b"
```

?

grammar

$$s \rightarrow a \mid (\Sigma \setminus a)b\Sigma^*$$

PANINI

PANINI program

- simple λ -calculus in A-normal form (ANF)
- refinement type system à la *Liquid Types*
- common string operations assumed as axioms
- idea: infer most precise refinement type for input string

ad hoc parser source

```
def parser(s):
    if s[0] == "a":
        assert len(s) == 1
    else:
        assert s[1] == "b"
```

SSA/ANF transformation



```
assert : {b : B | b} → 1
equals : (a : Z) → (b : Z) → {c : B | c ⇔ a = b}
length : (s : S) → {n : N | n = |s|}
charAt : (s : S) → {i : N | i < |s|} → {t : S | t = s[i]}
match : (s : S) → (t : S) → {b : B | b ⇔ s = t}

parser : S → 1
= λs.
  let x = charAt s 0 in
  let p1 = match x "a" in
  if p1 then
    let n = length s in
    let p2 = equals n 1 in
    assert p2
  else
    let y = charAt s 1 in
    let p3 = match y "b" in
    assert p3
```

Refinement Types 101

Refined Base Types

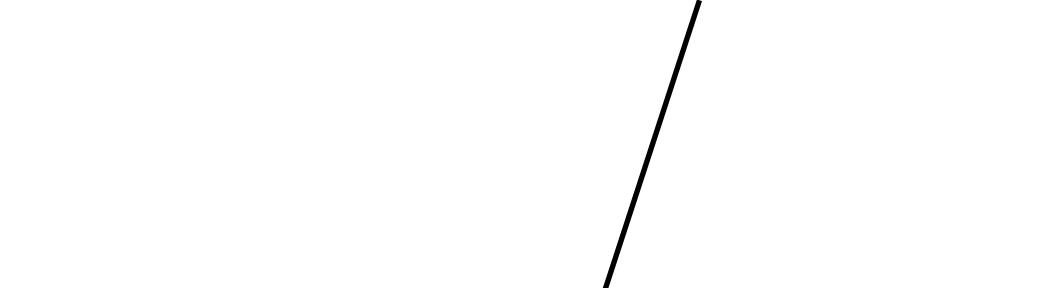
$$\{n : \text{int} \mid n \geq 0\}$$

base type

refinement predicate
in a decidable logic
(e.g., QF_UFLIA)

Refinement Types 101

Dependent Function Types

$$\text{length} : (s : \text{string}) \rightarrow \{n : \text{int} \mid n \geq 0 \wedge n = |s|\}$$


output types can
refer to input types

Refinement Types 101

Verification Conditions

term

`let n = length s in ...`

type

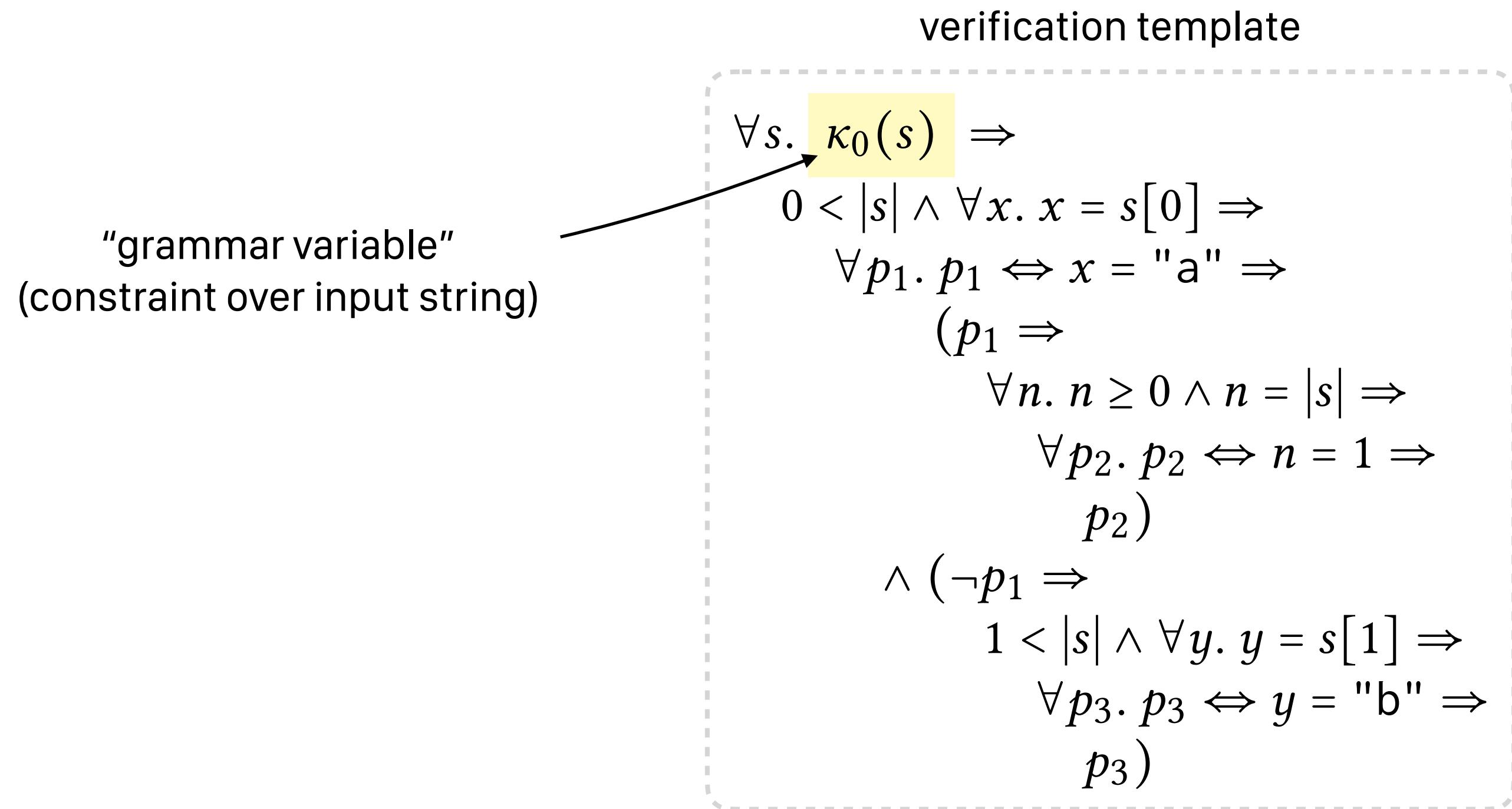
$\{n : \text{int} \mid n \geq 0 \wedge n = |s|\}$

verification
condition

$\forall n . n \geq 0 \wedge n = |s| \Rightarrow \dots$

Refinement Inference

- κ variables represent unknown refinements
- most can be solved precisely (e.g., using FUSION)
- existing approaches struggle with “grammar variables”



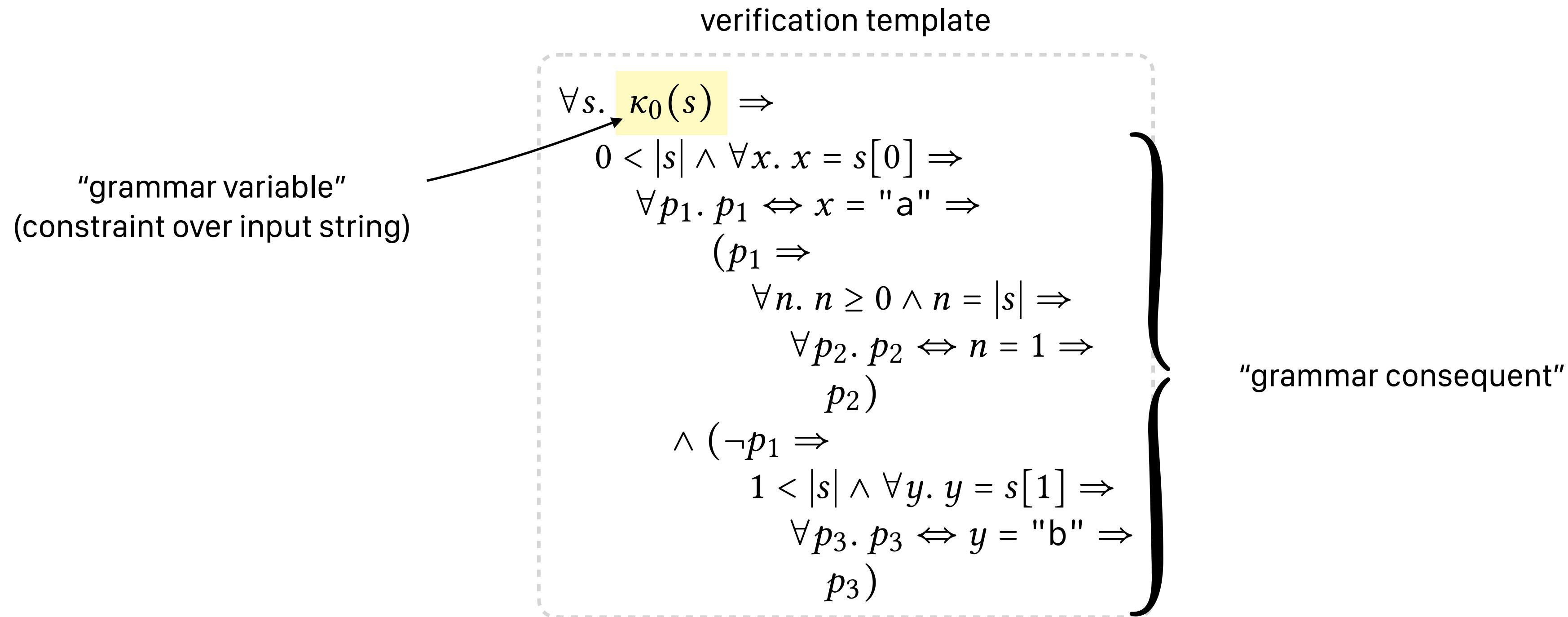
PANINI program

```
assert : {b : B | b} → 1
equals : (a : Z) → (b : Z) → {c : B | c ⇔ a = b}
length : (s : S) → {n : N | n = |s|}
charAt : (s : S) → {i : N | i < |s|} → {t : S | t = s[i]}
match : (s : S) → (t : S) → {b : B | b ⇔ s = t}
```

```
parser : {s : S | κ₀(s) } → 1
= λs.
  let x = charAt s 0 in
  let p₁ = match x "a" in
  if p₁ then
    let n = length s in
    let p₂ = equals n 1 in
    assert p₂
  else
    let y = charAt s 1 in
    let p₃ = match y "b" in
    assert p₃
```

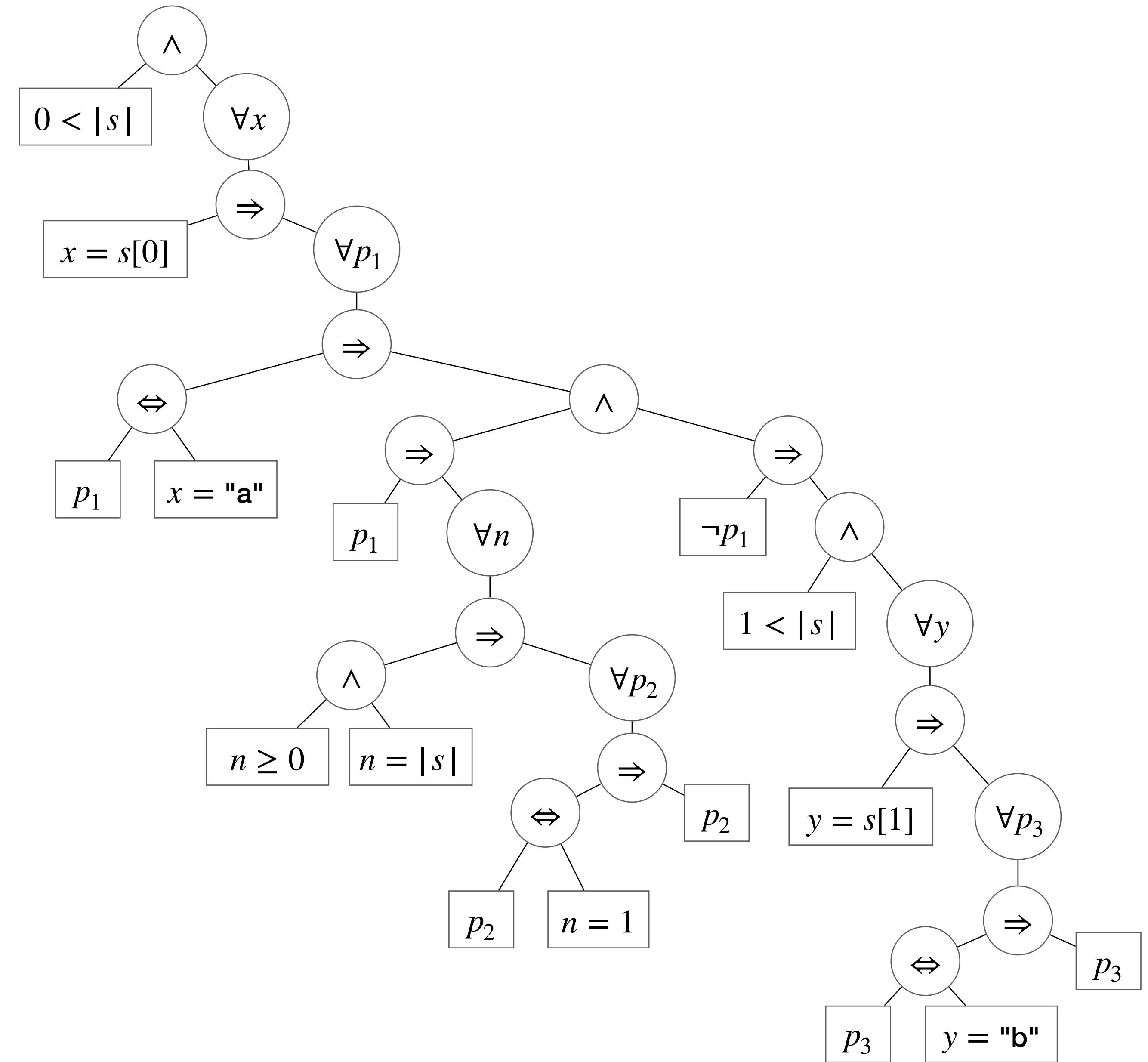
Grammar Solving

- base solution on “grammar consequent”



Grammar Solving

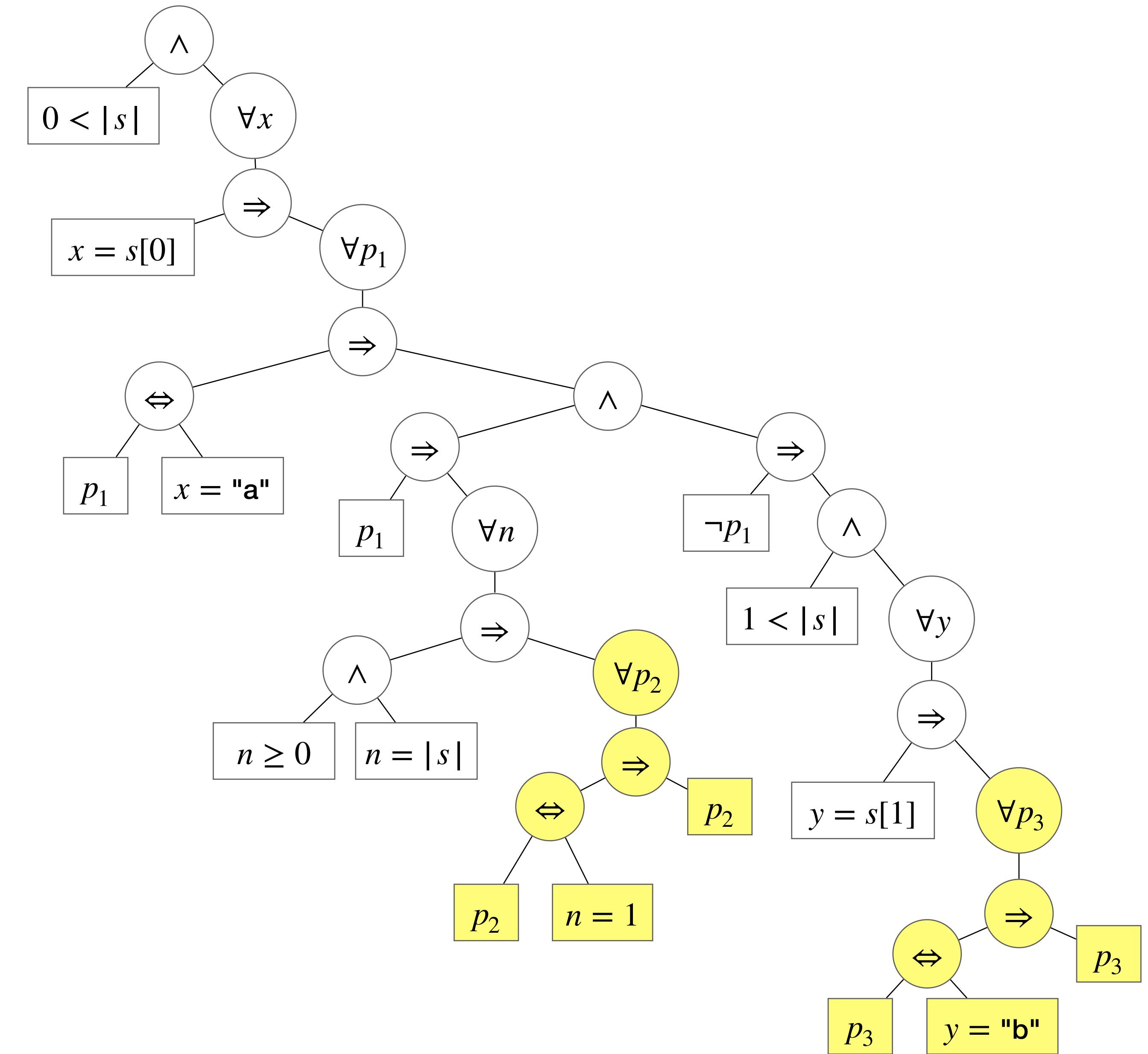
- base solution on “grammar consequent”
- minimize via bottom-up tree rewriting
- apply Boolean equivalences to reach DNF
- eliminate quantifiers by resolving equations
- use (precise) abstract value representations



Grammar Solving

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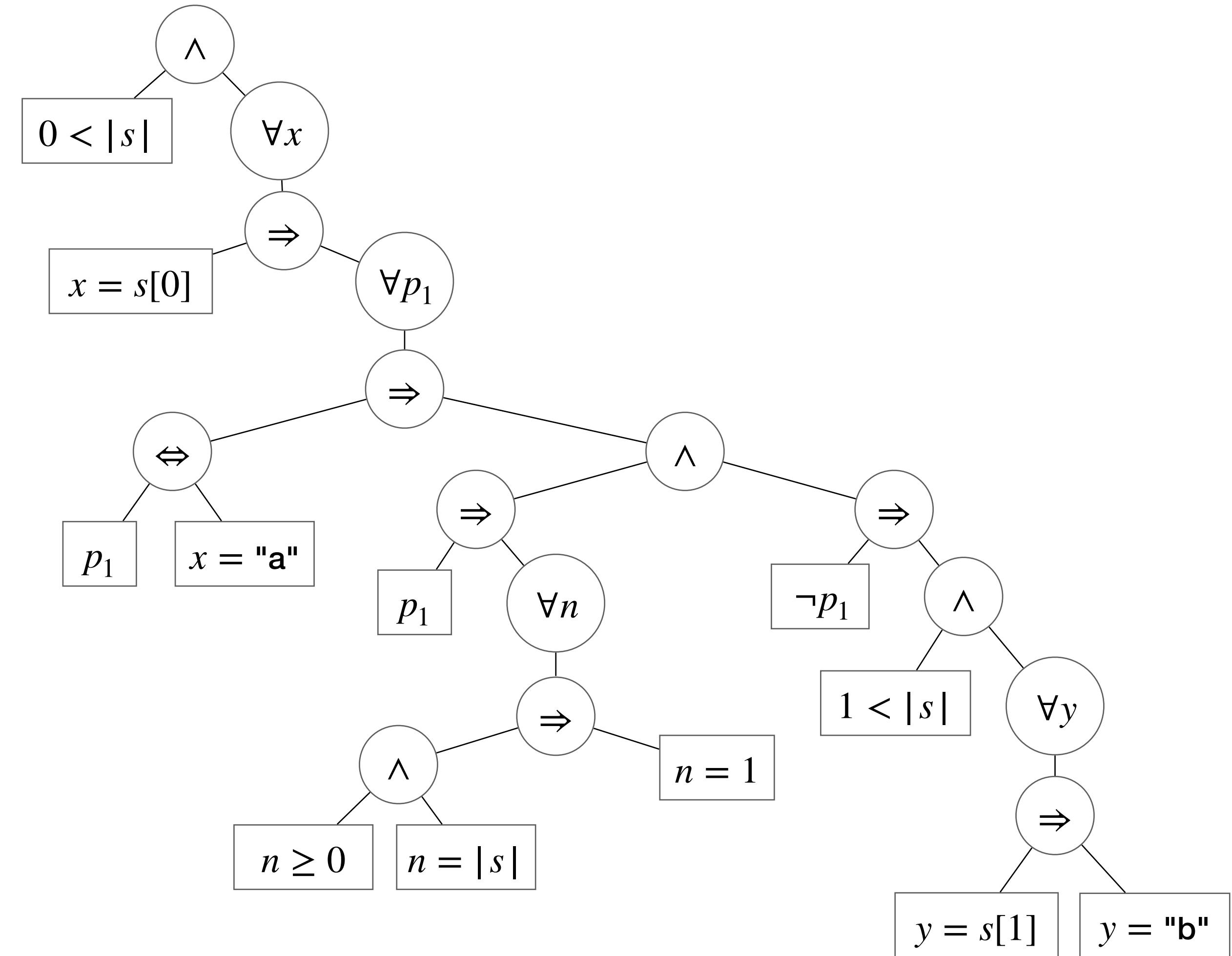
$$\forall a . (a \Leftrightarrow b) \Rightarrow a \rightarrow b$$



Grammar Solving

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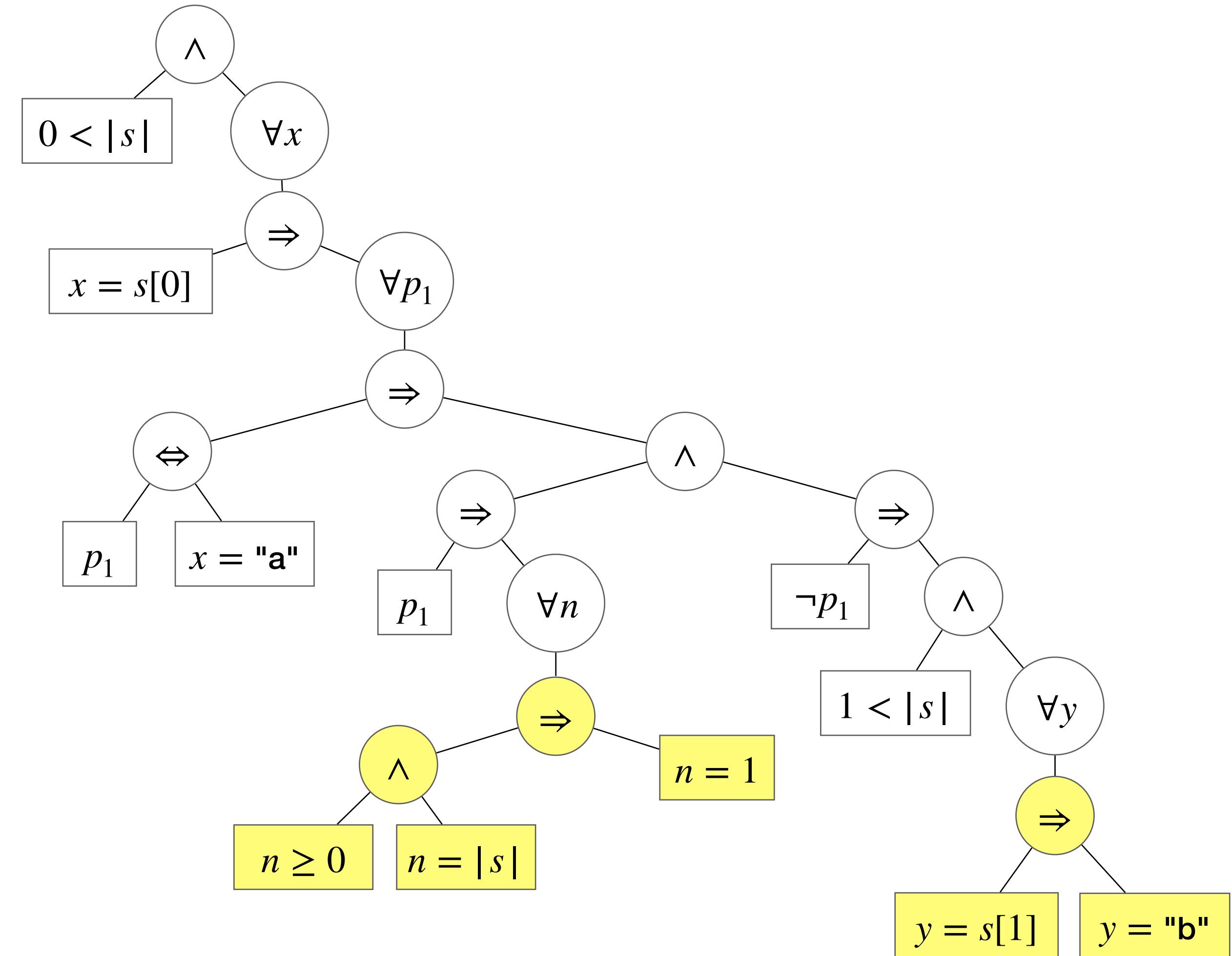
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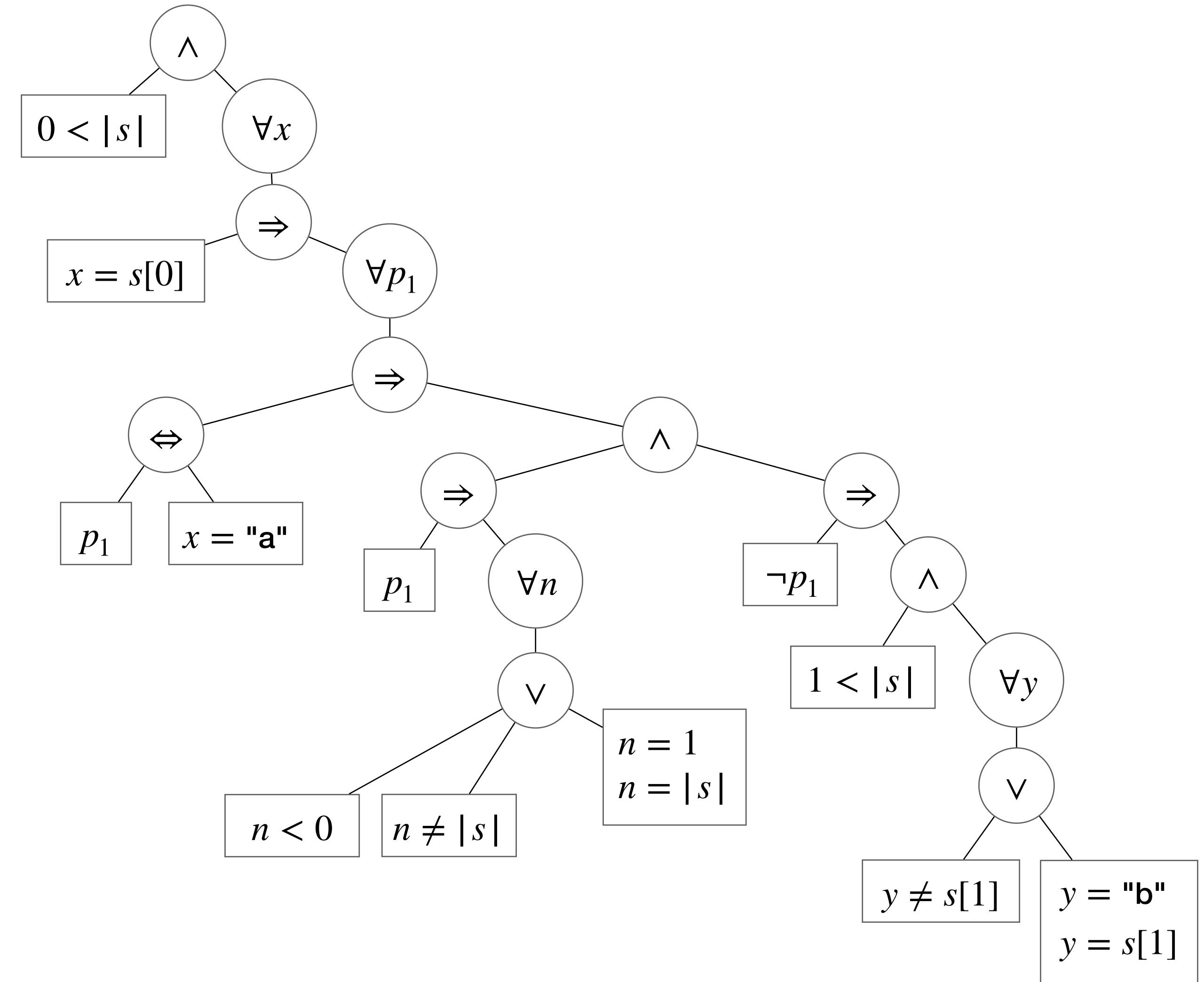
$$a \Rightarrow b \quad \rightarrow \quad \neg a \vee (a \sqcap b)$$



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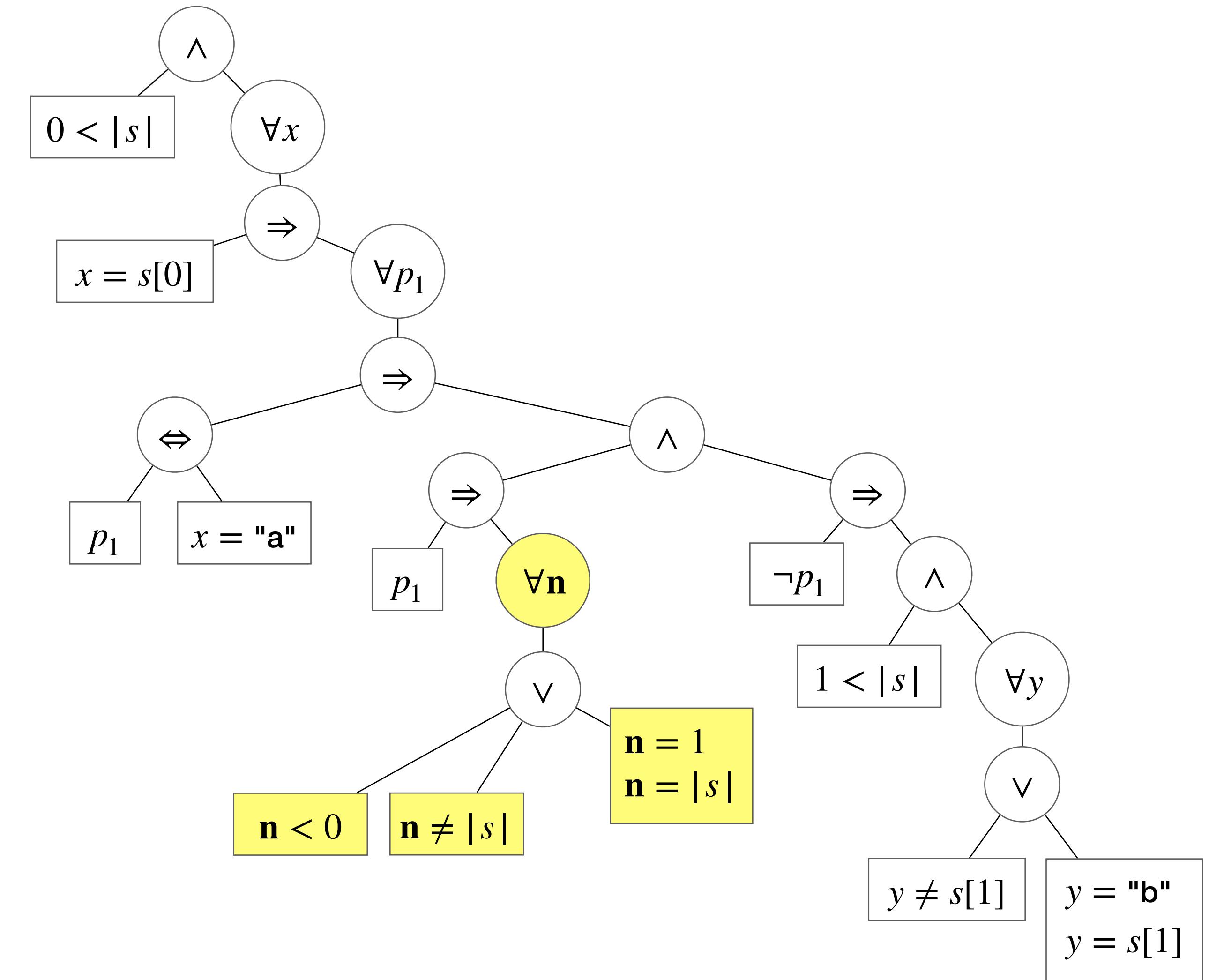
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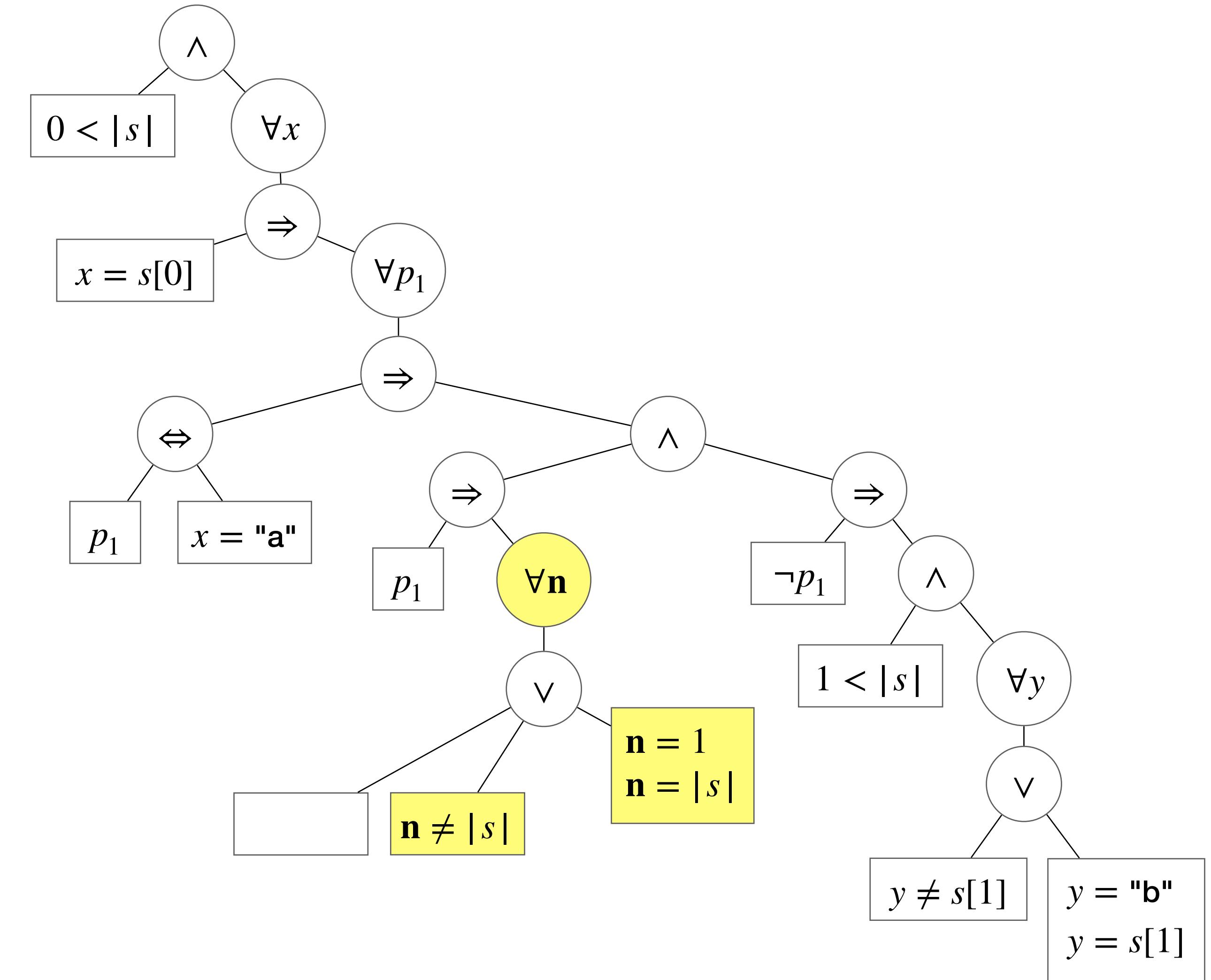
$\forall x . \varphi \rightarrow \text{resolve } x \text{ in } \varphi$



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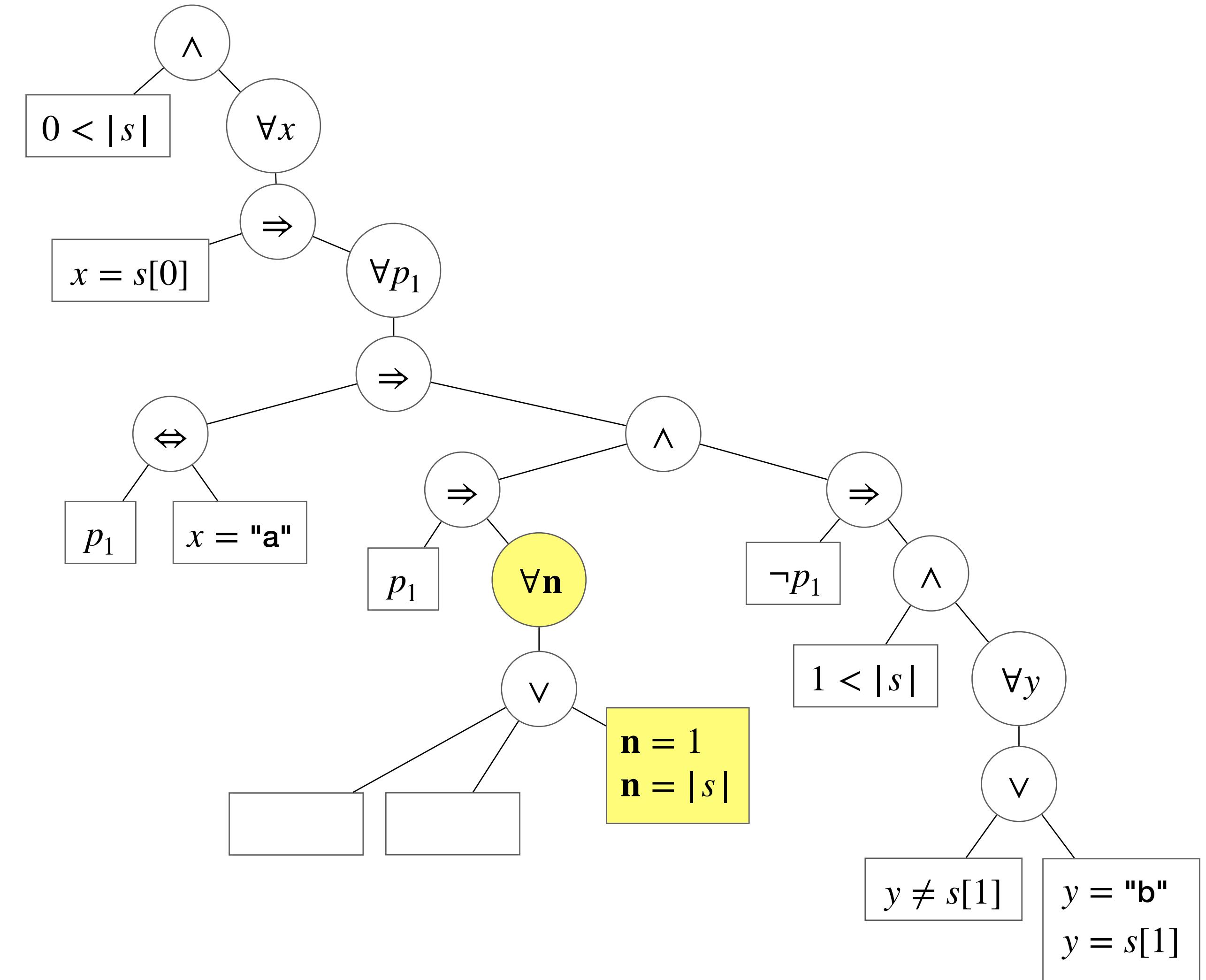
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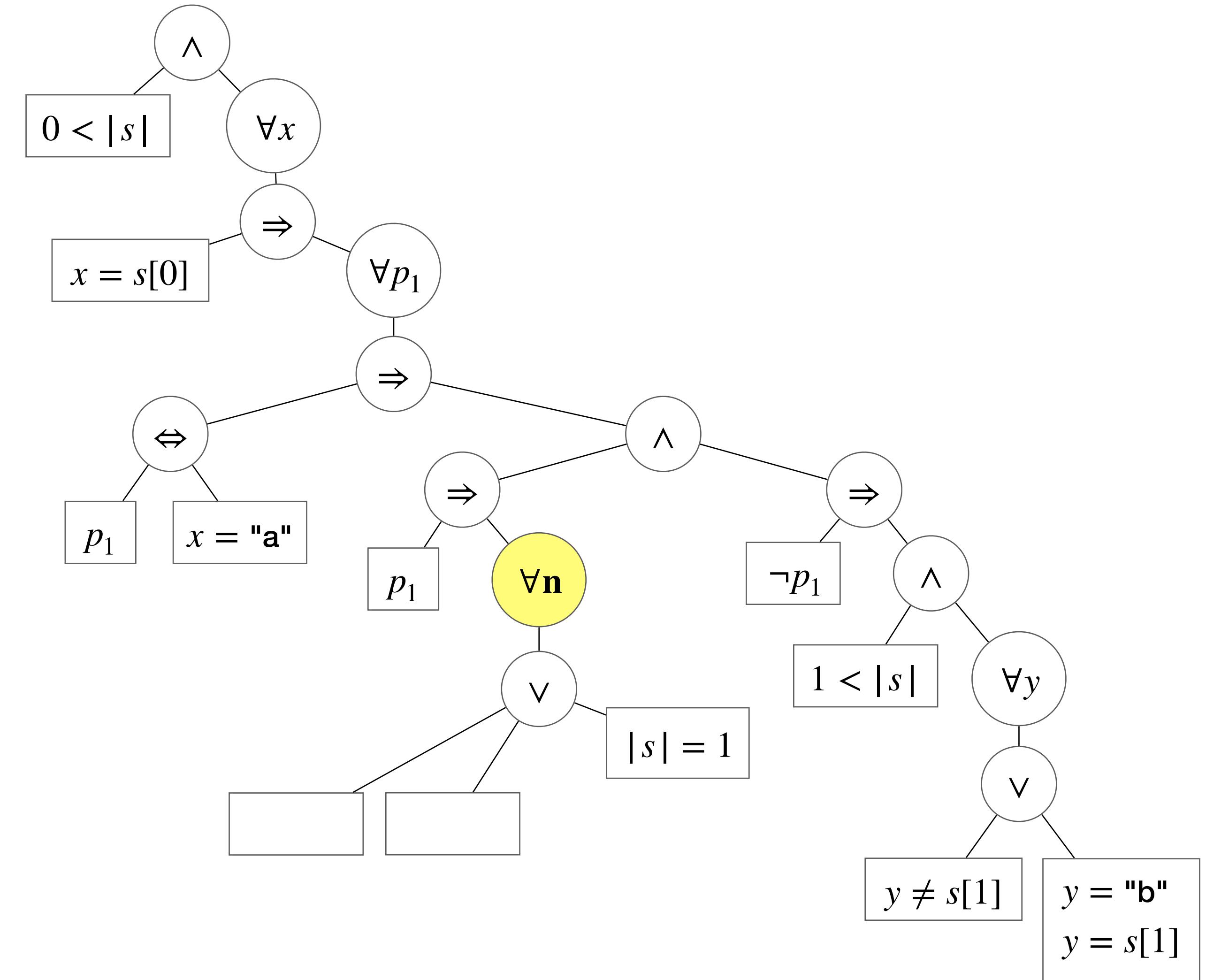
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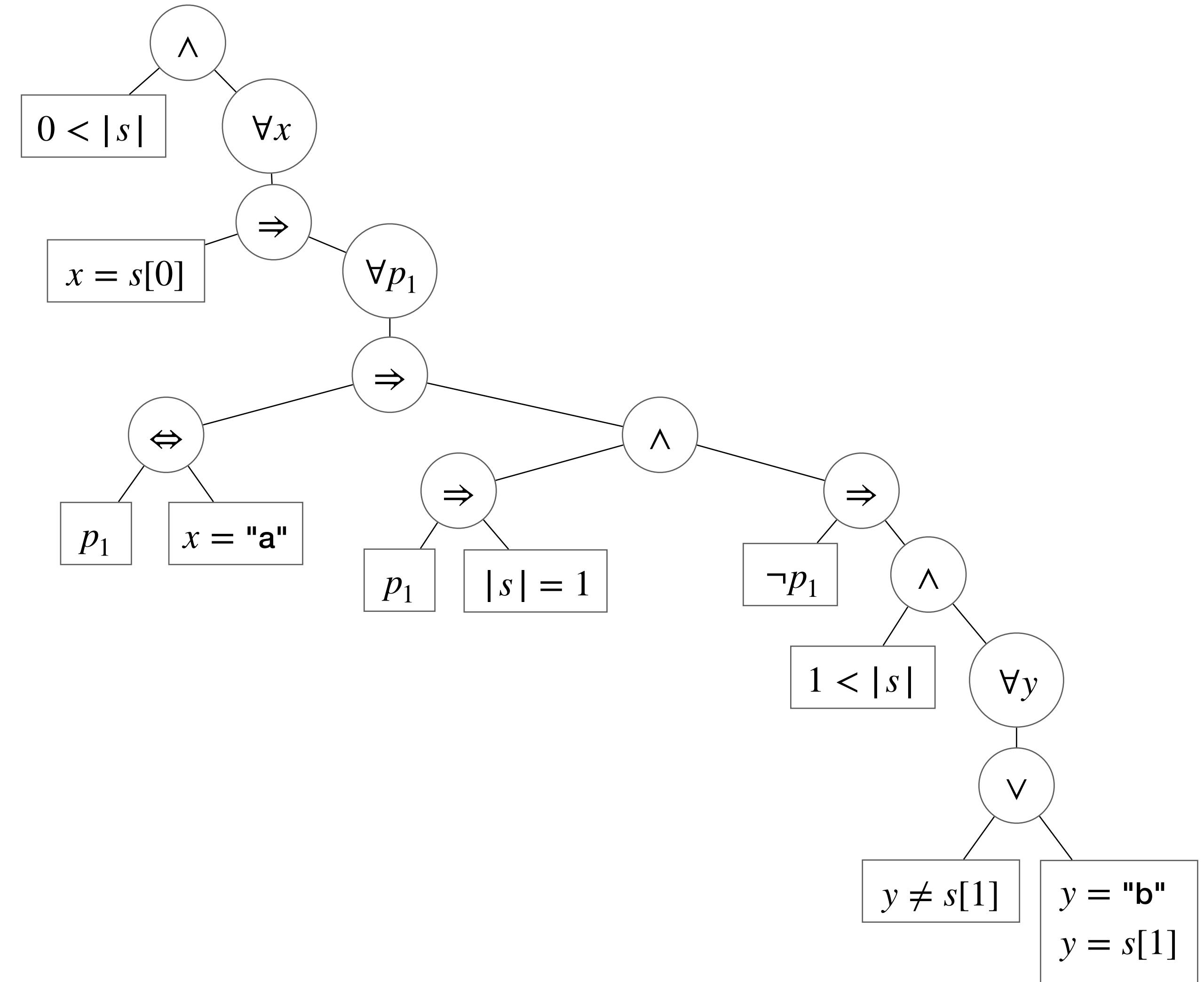
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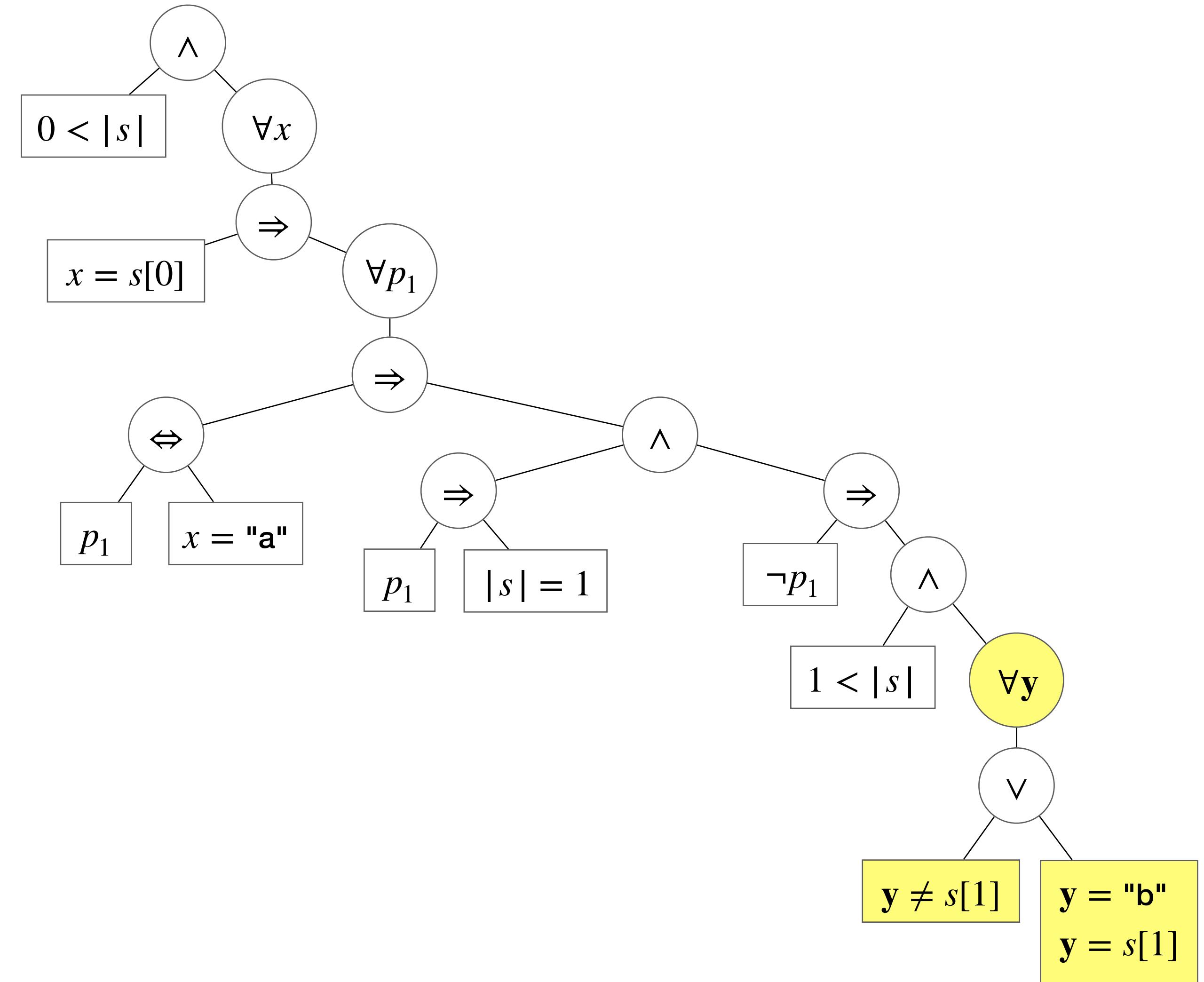
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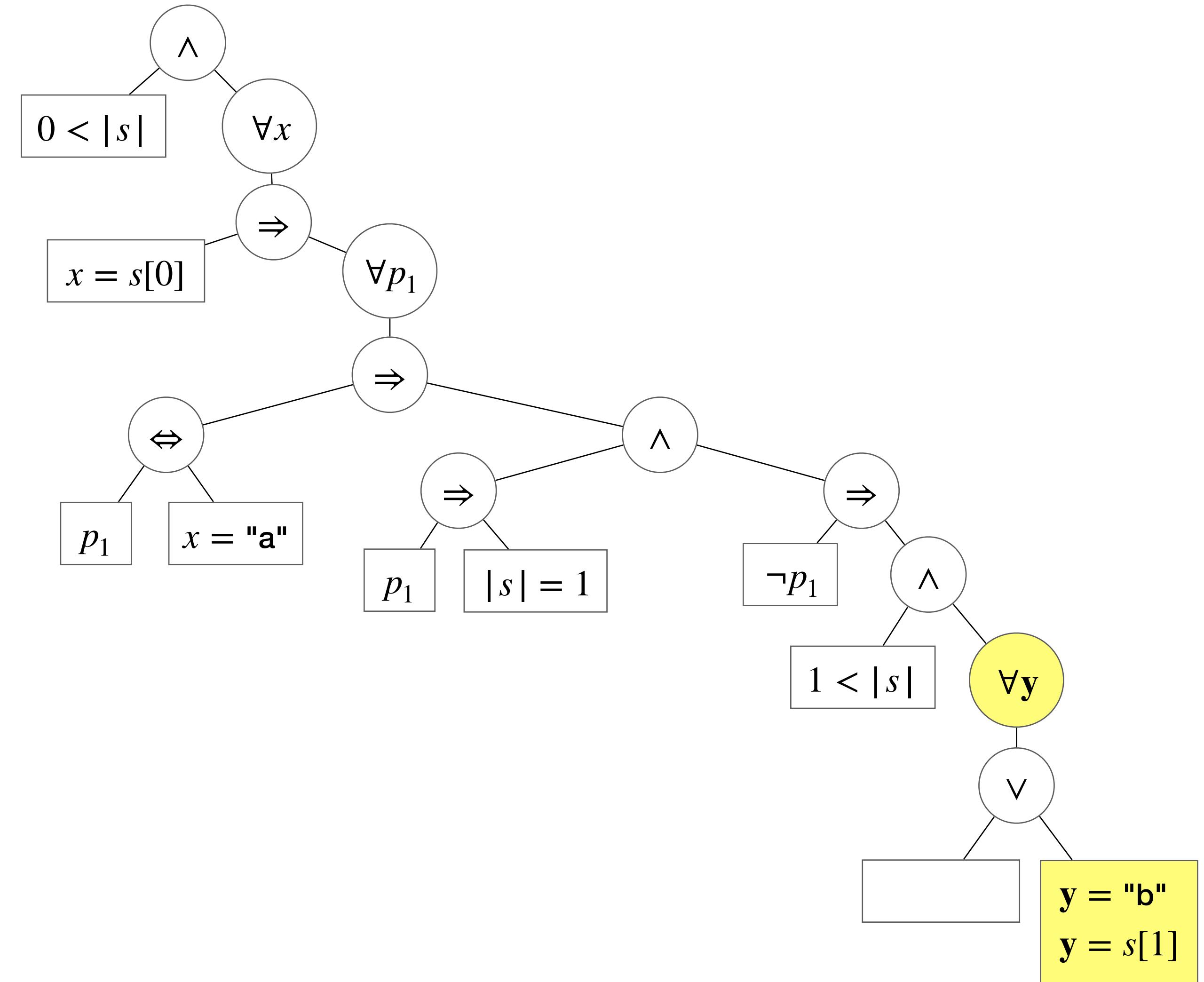
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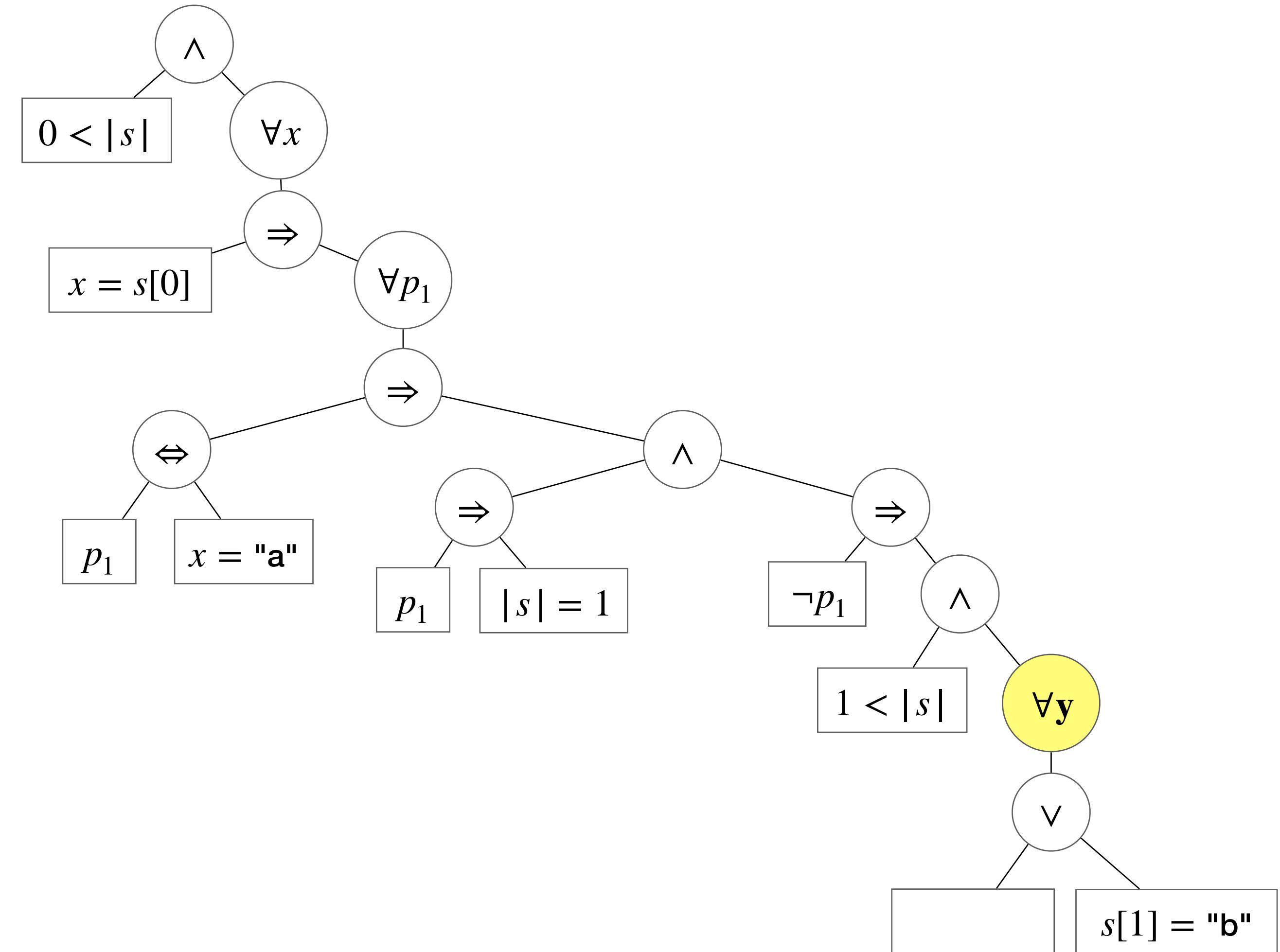
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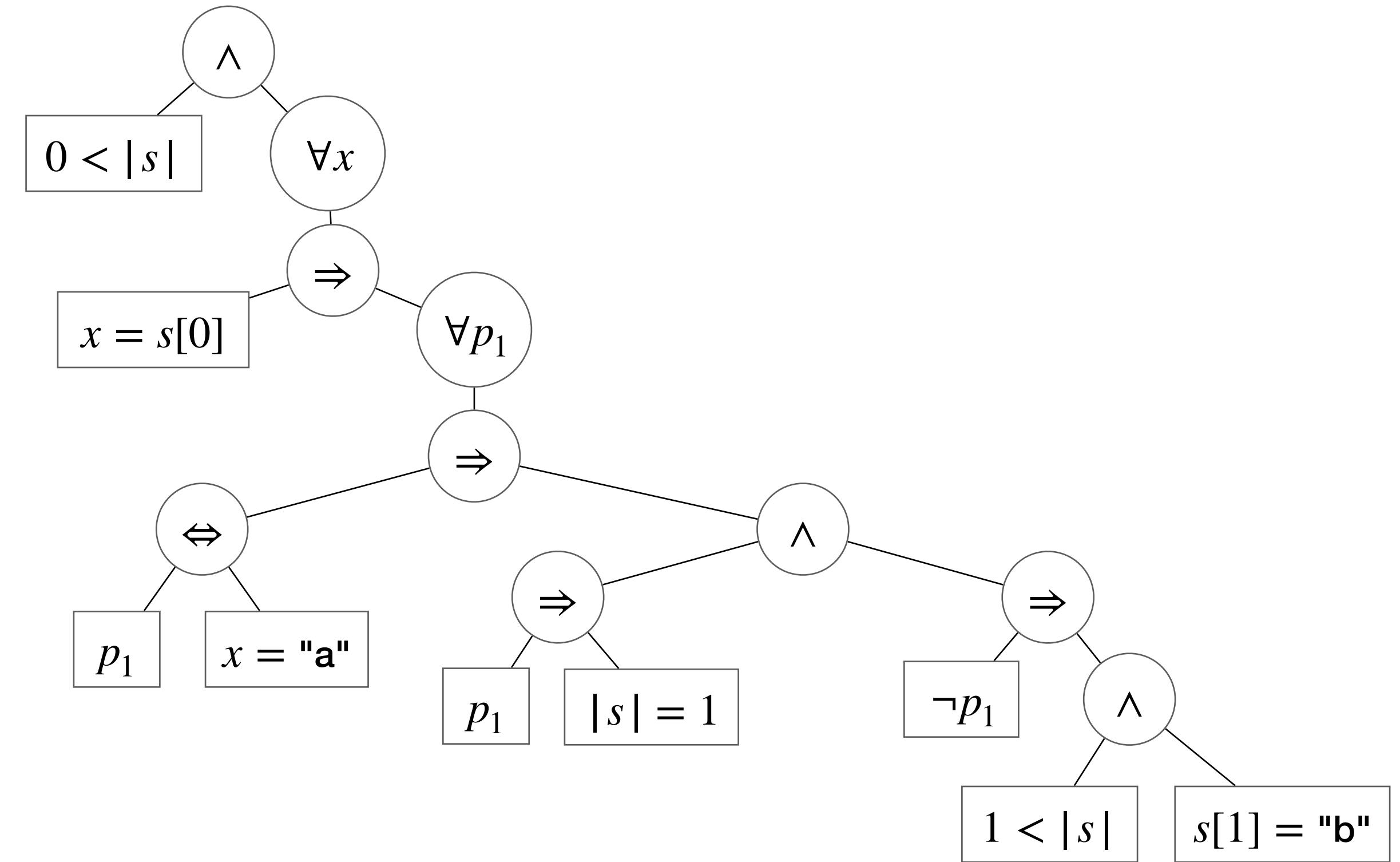
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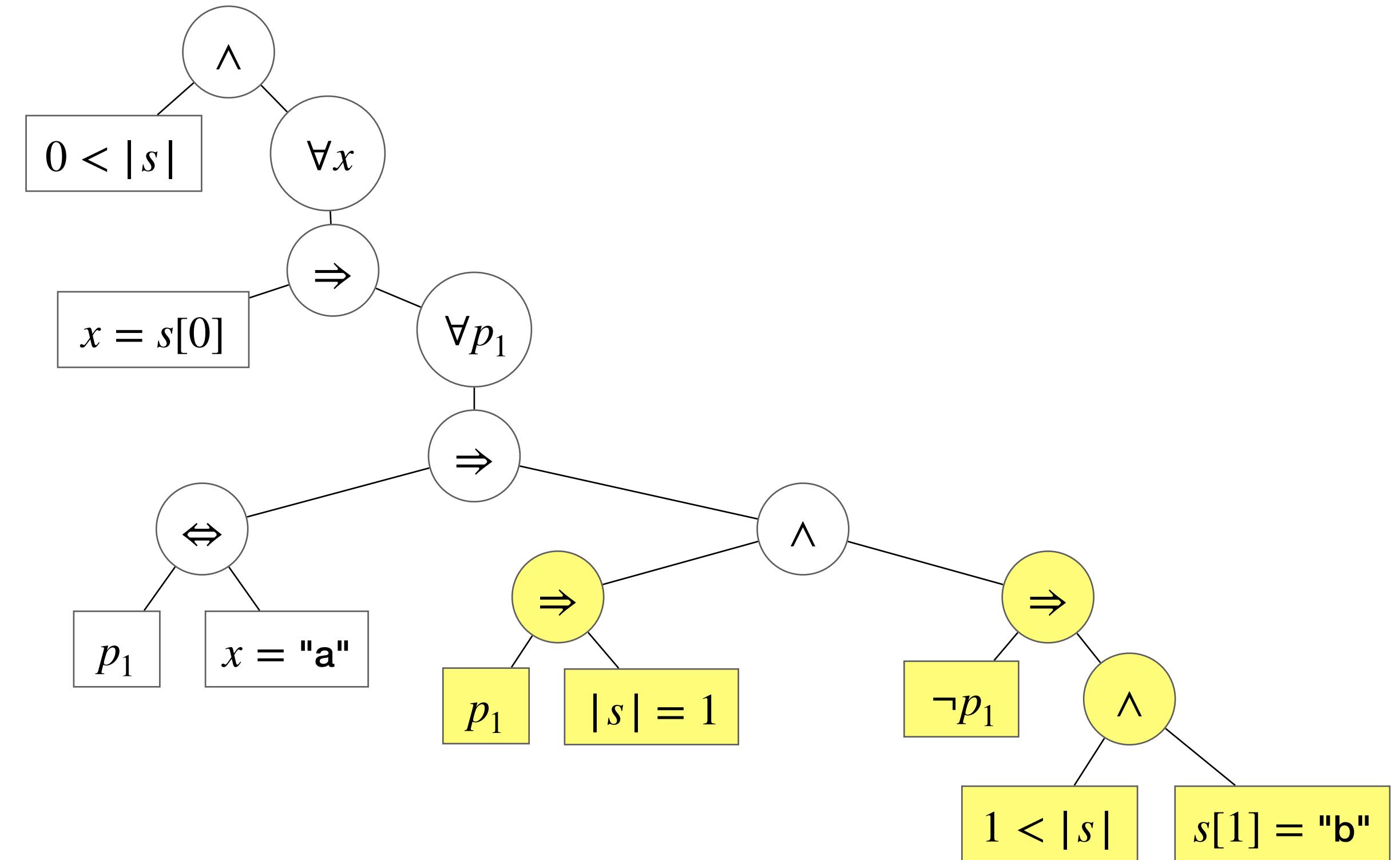
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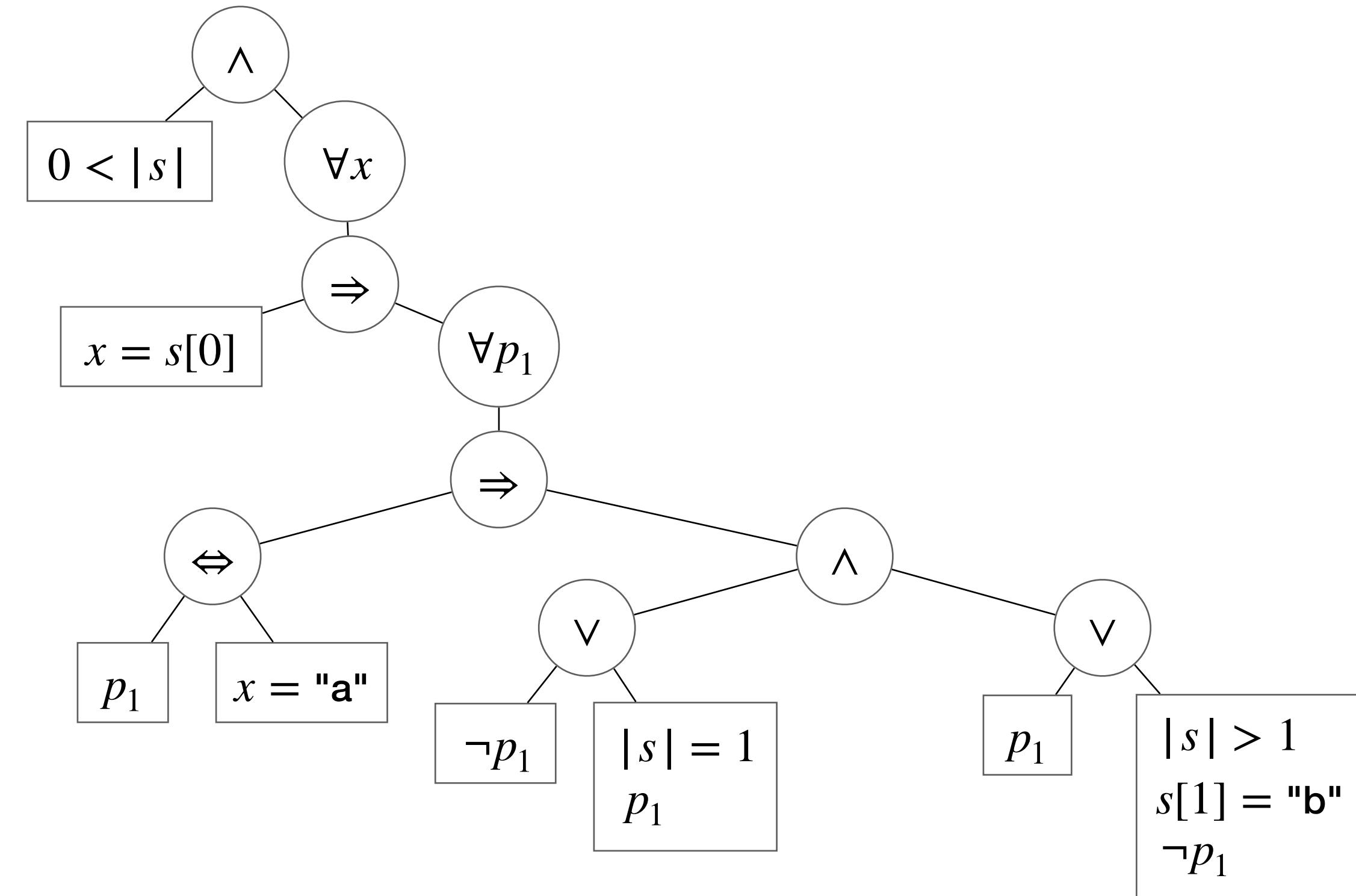
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$$a \Rightarrow b \quad \rightarrow \quad \neg a \vee (a \sqcap b)$$

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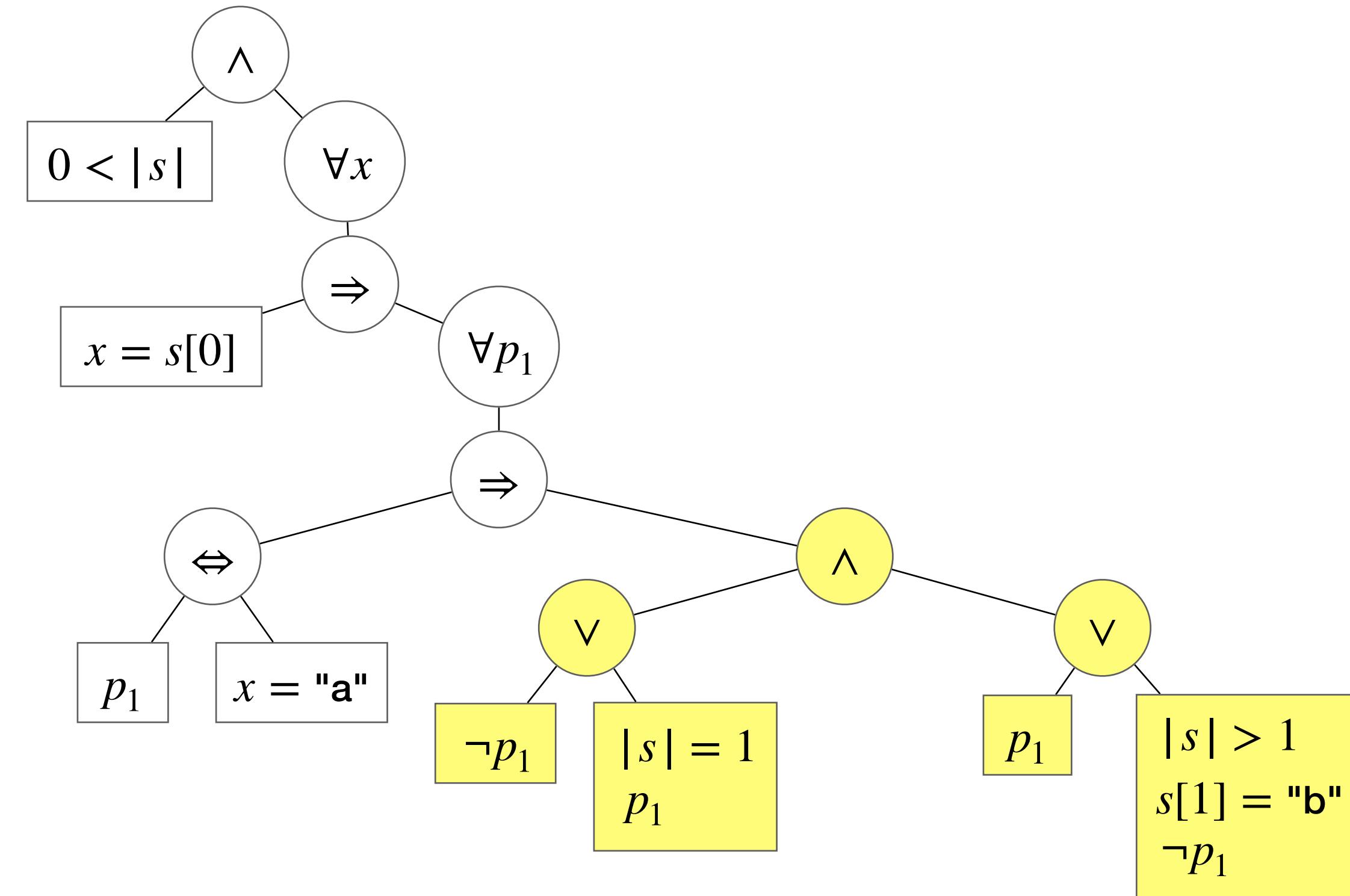
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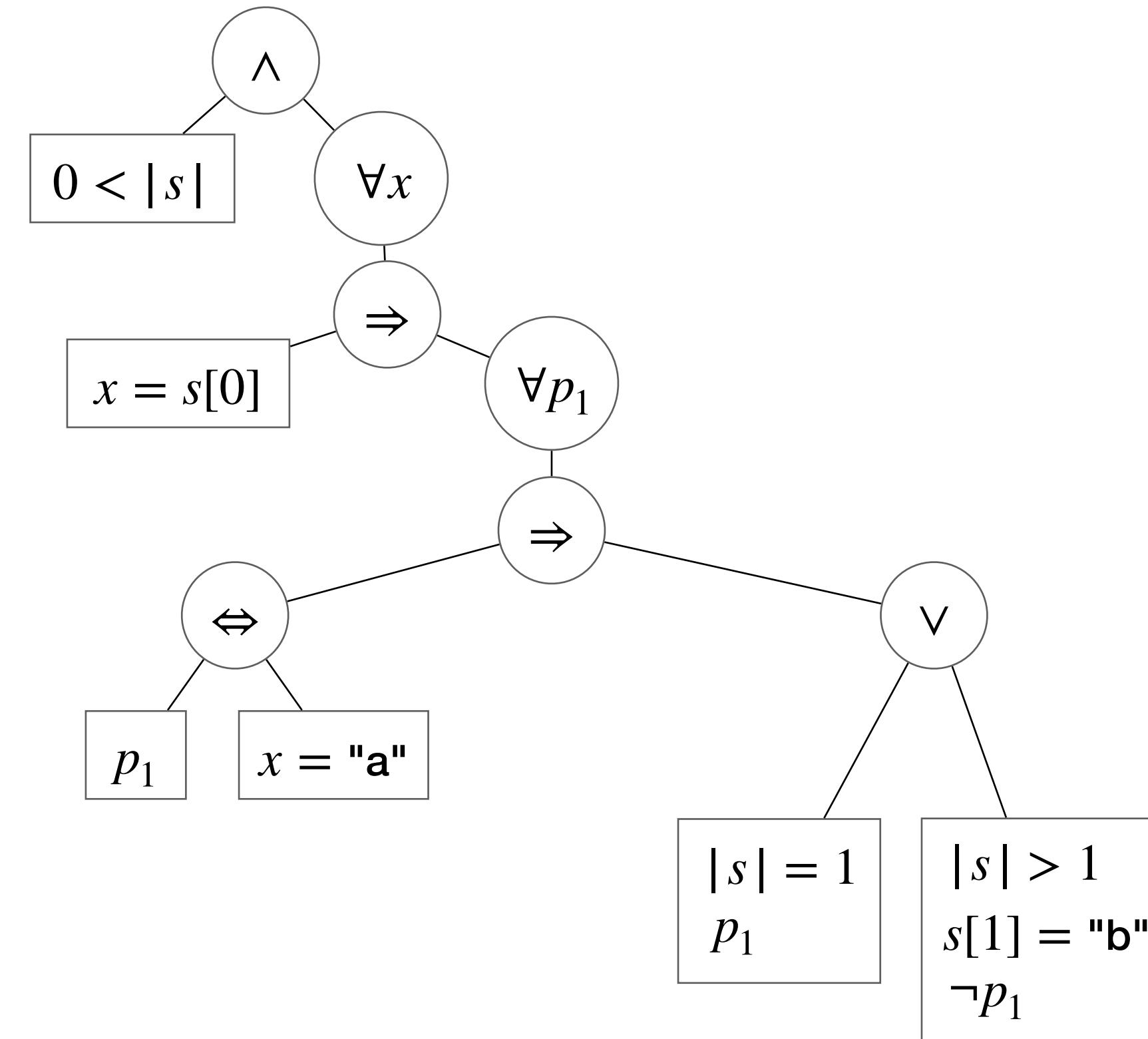
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$$(a \vee b) \wedge (\neg a \vee c) \rightarrow b \vee c$$

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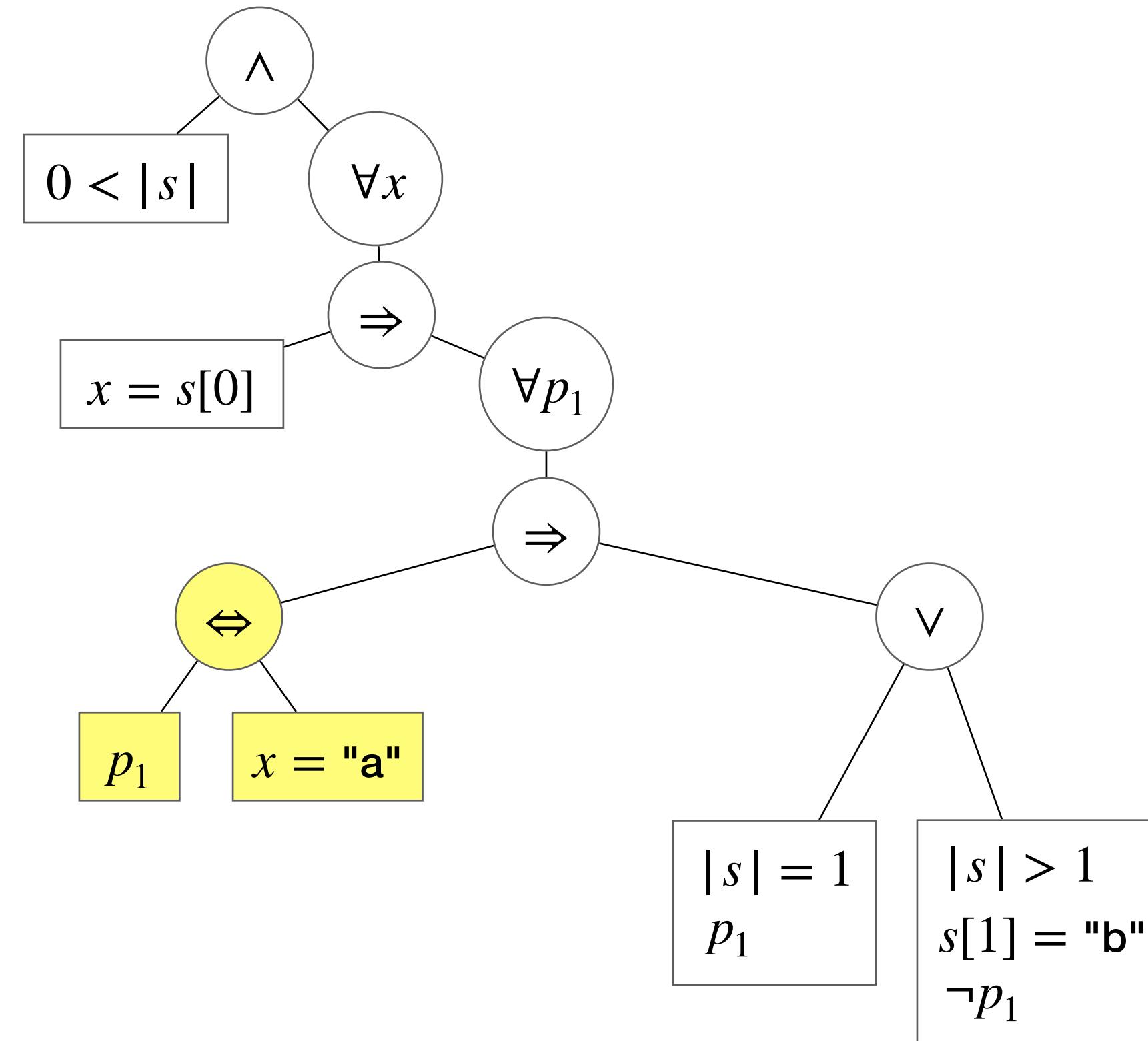
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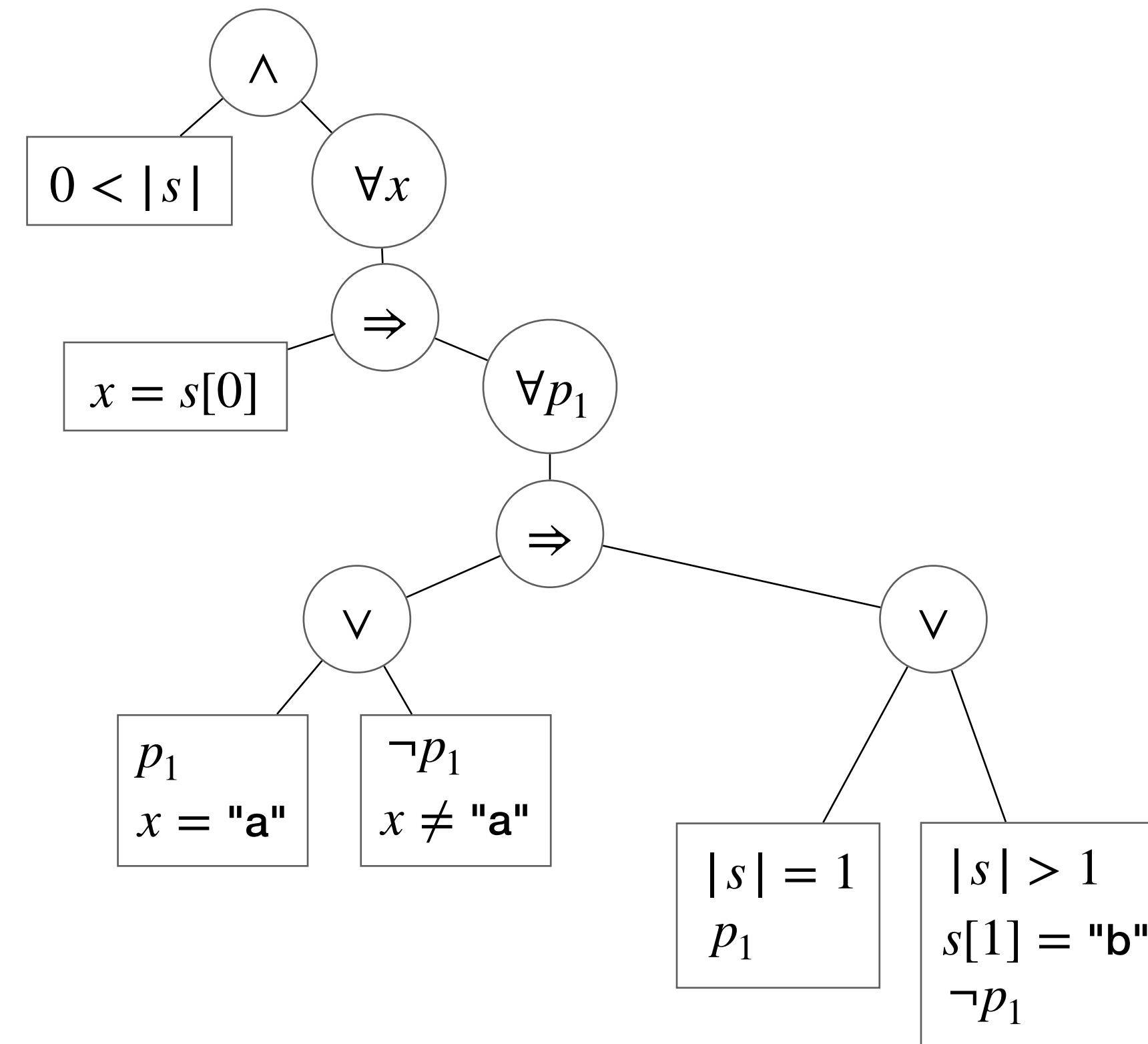
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$$a \Leftrightarrow b \quad \rightarrow \quad (\neg a \wedge \neg b) \vee (a \wedge b)$$

Grammar Solving

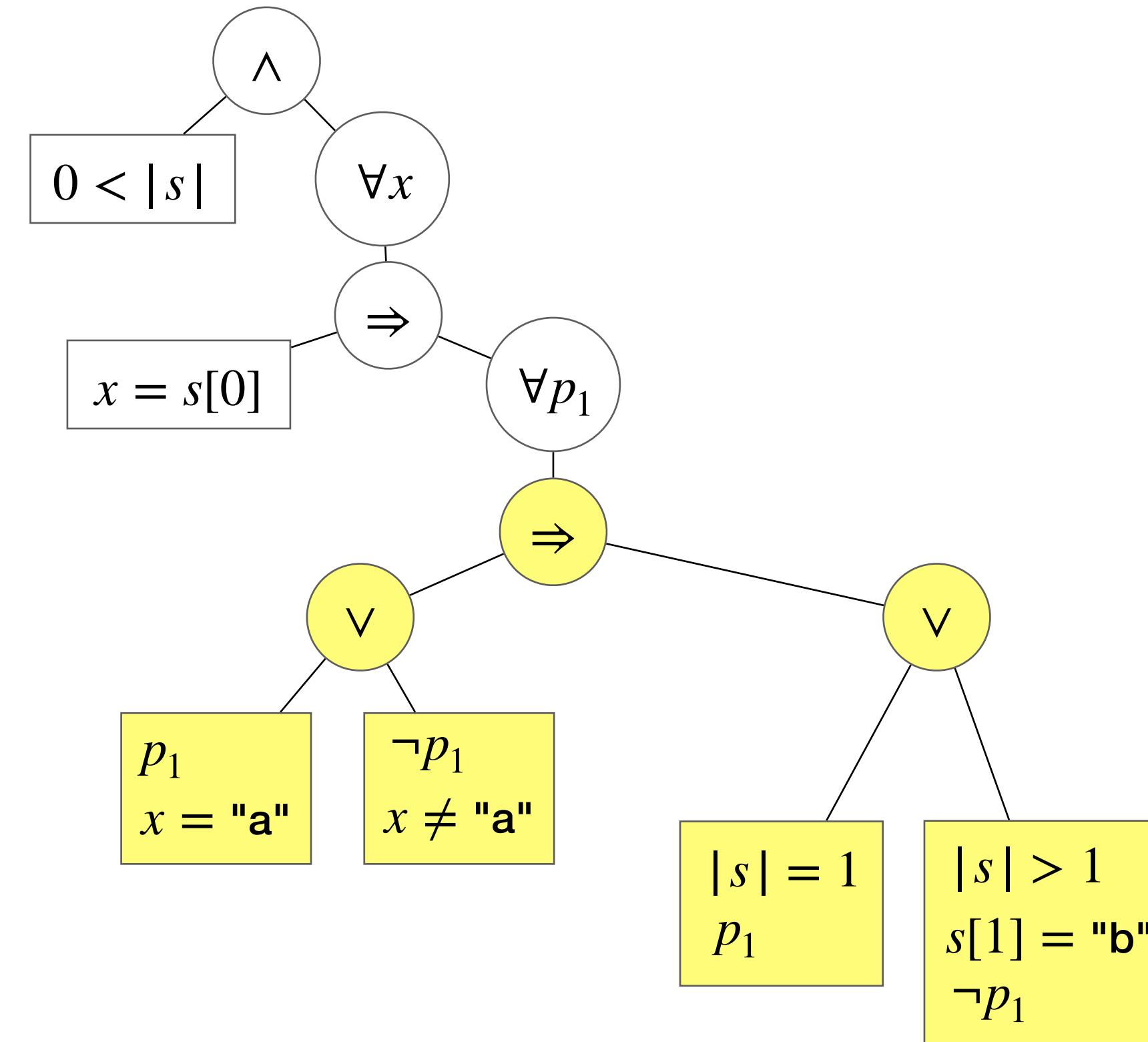
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$$a \Leftrightarrow b \quad \rightarrow \quad (\neg a \wedge \neg b) \vee (a \wedge b)$$

Grammar Solving

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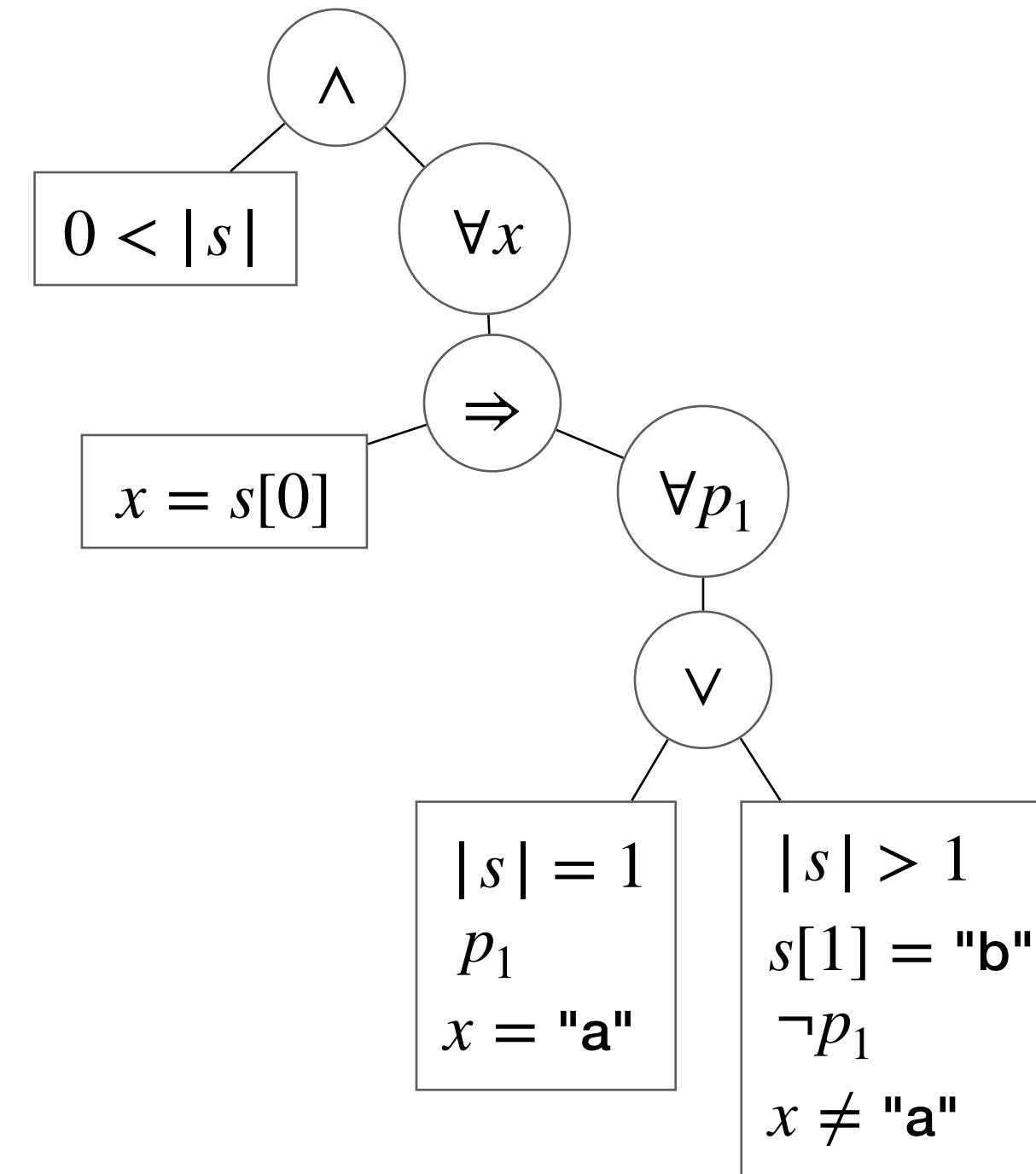


$$(a \vee b) \Rightarrow c \rightarrow (a \Rightarrow c) \vee (b \Rightarrow c)$$

$$a \Rightarrow b \rightarrow \neg a \vee (a \sqcap b)$$

Grammar Solving

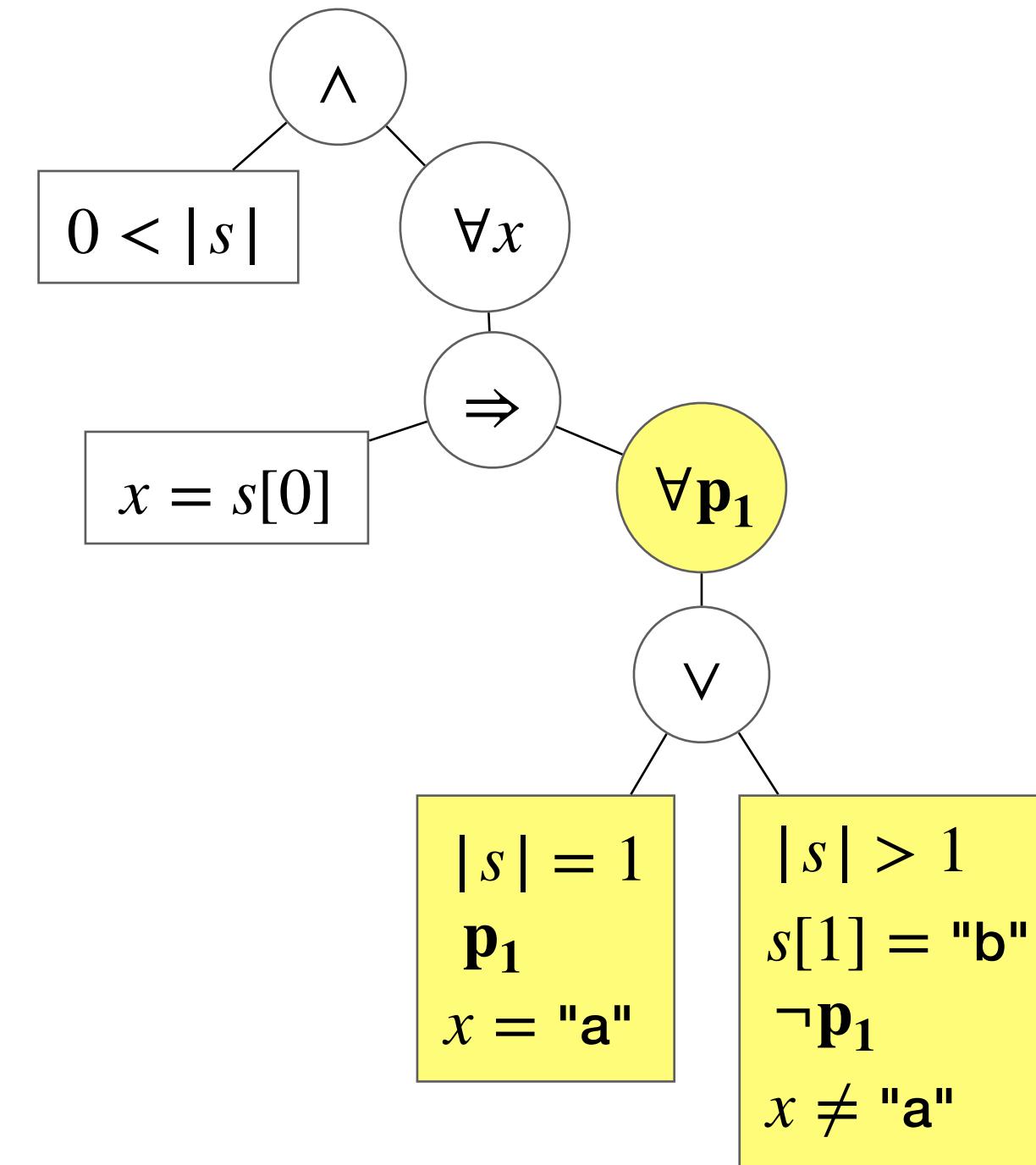
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$$\begin{array}{lcl} (a \vee b) \Rightarrow c & \rightarrow & (a \Rightarrow c) \vee (b \Rightarrow c) \\ a \Rightarrow b & \rightarrow & \neg a \vee (a \sqcap b) \end{array}$$

Grammar Solving

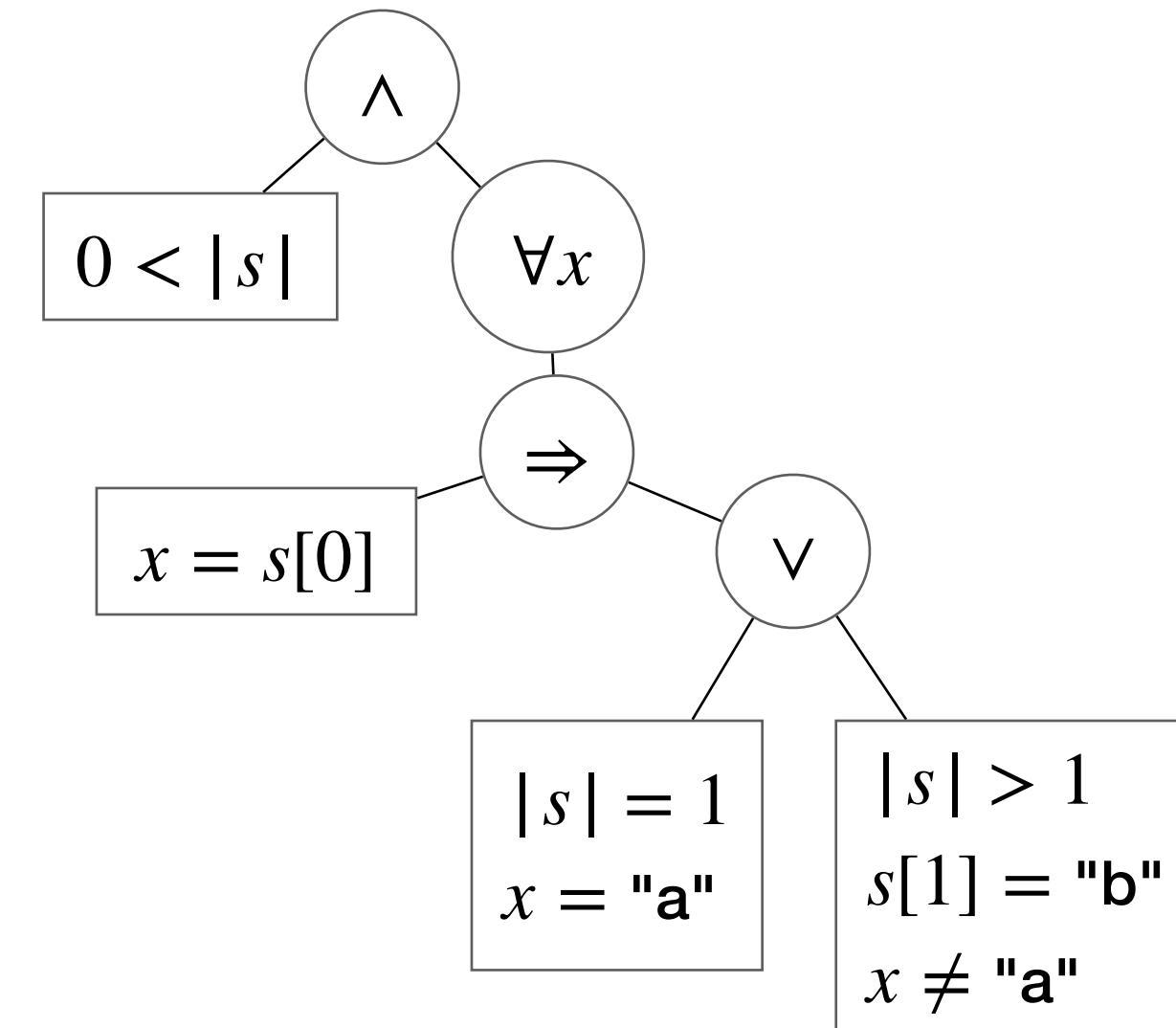
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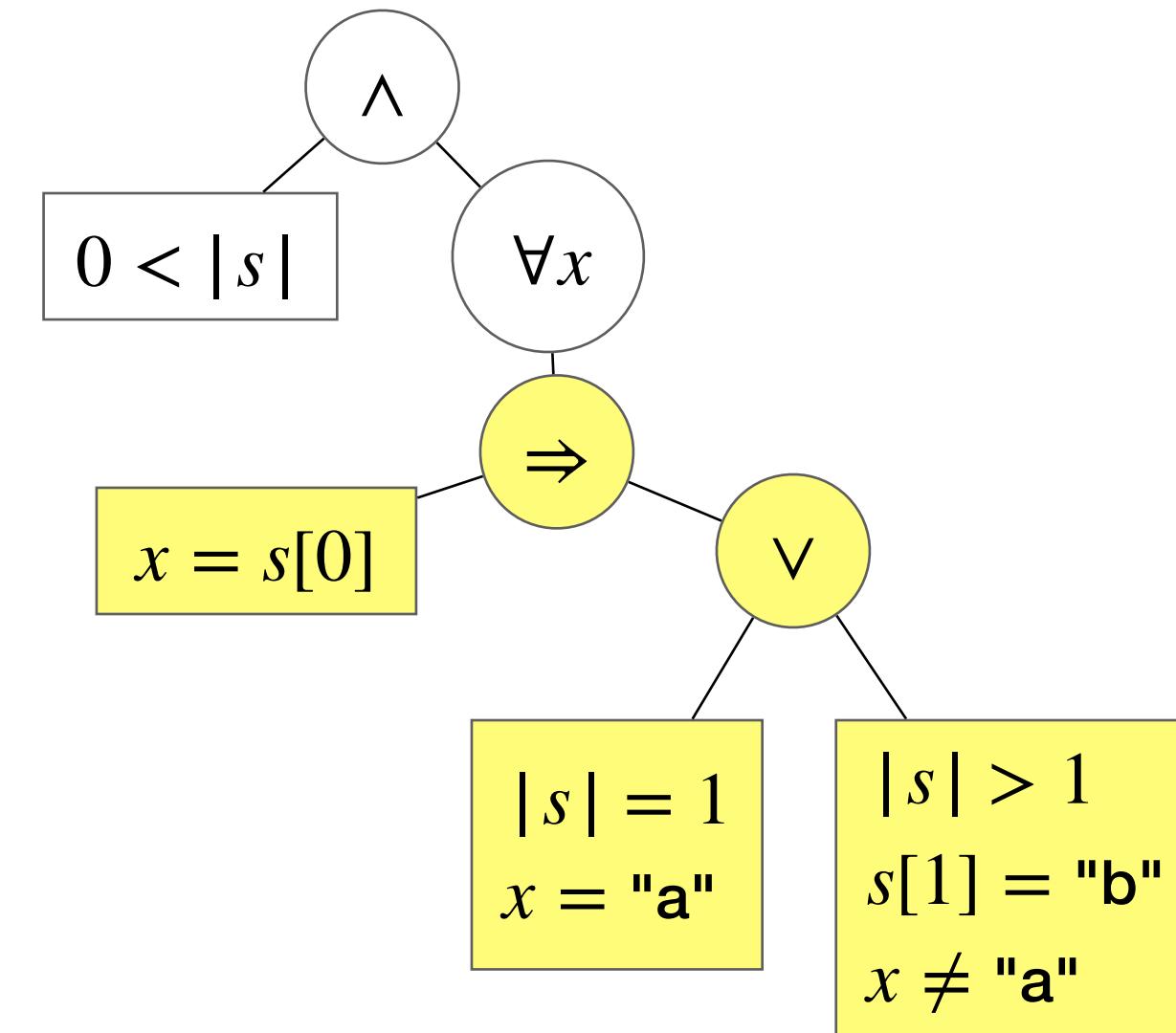
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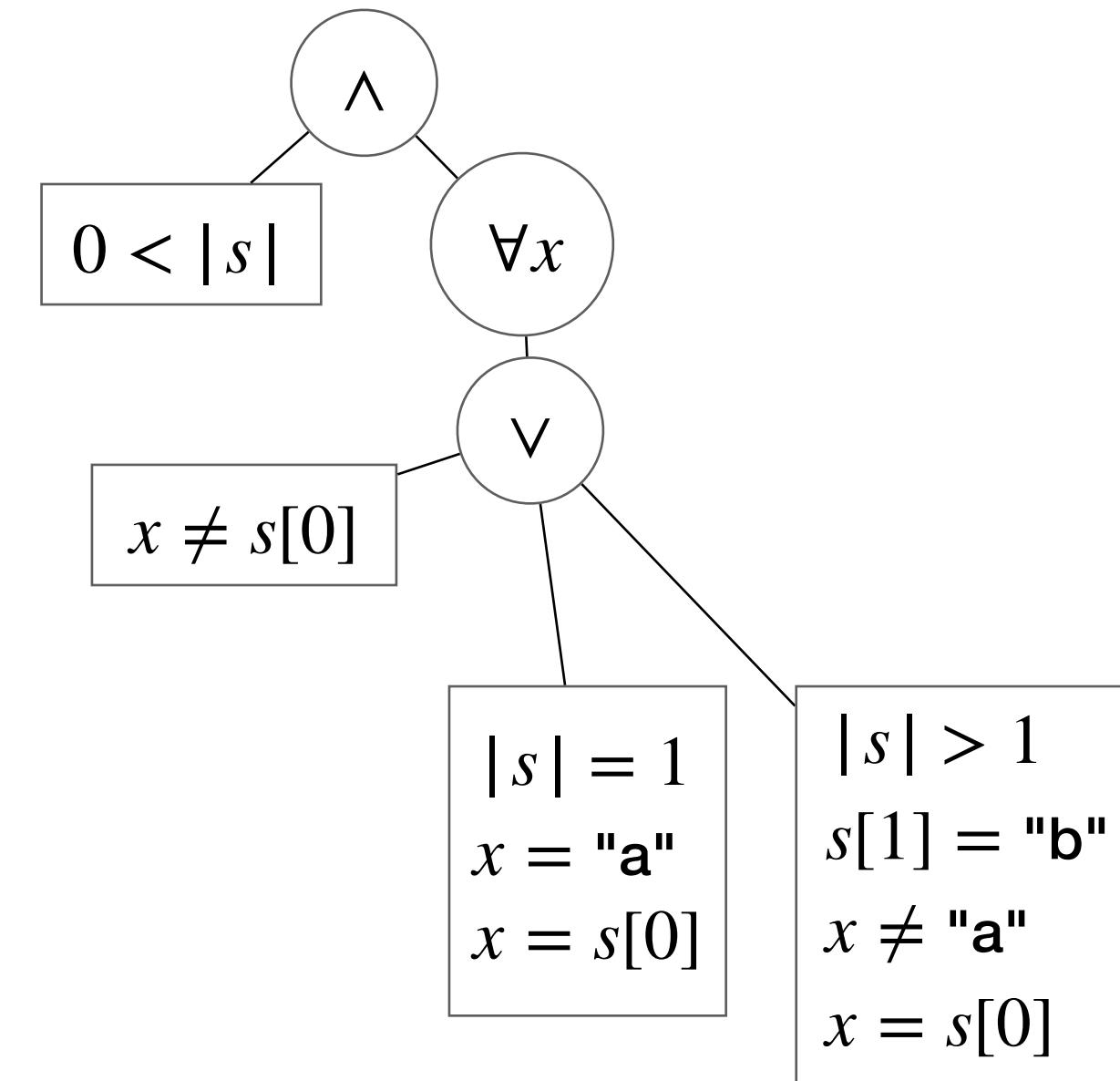
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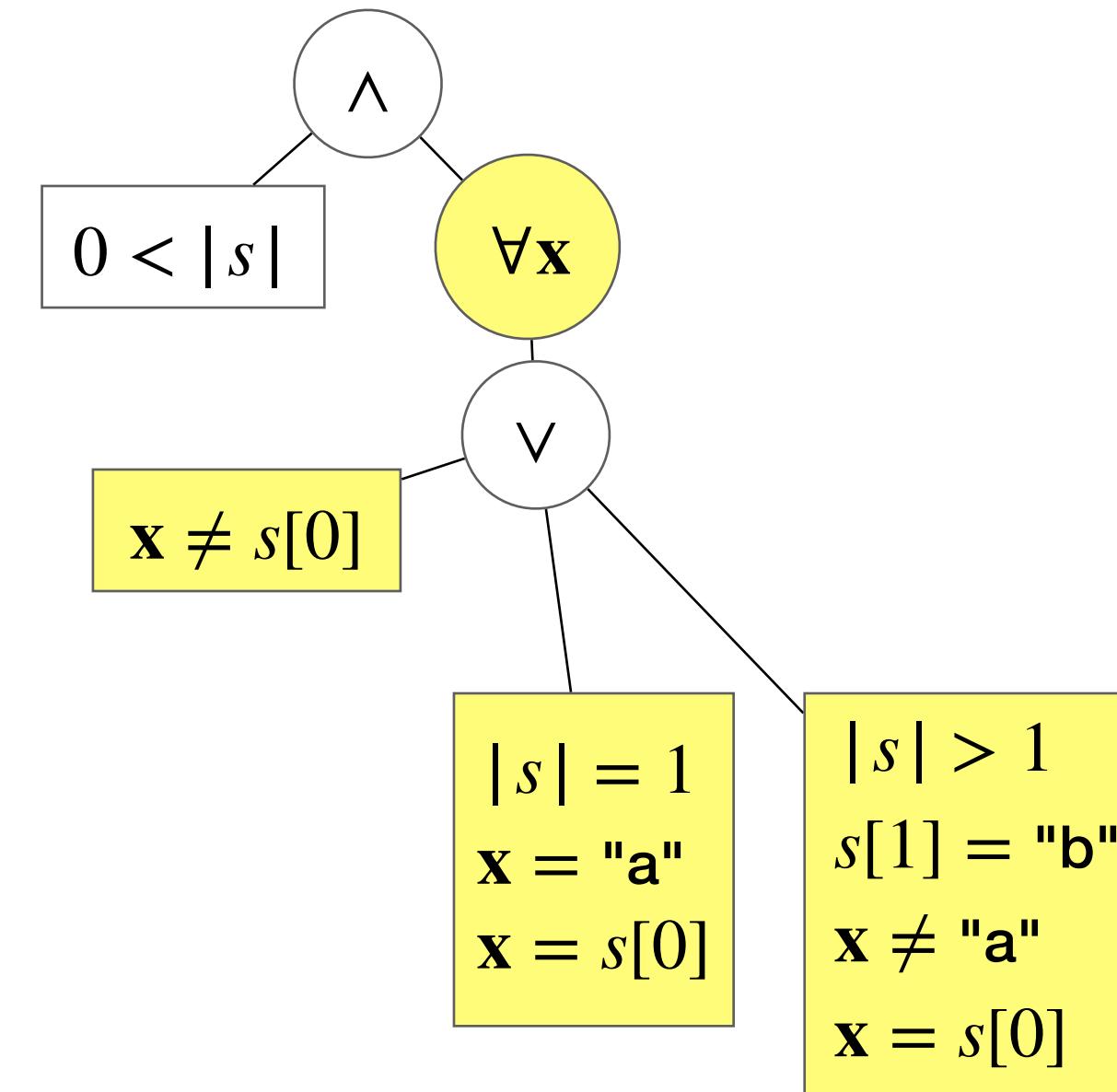
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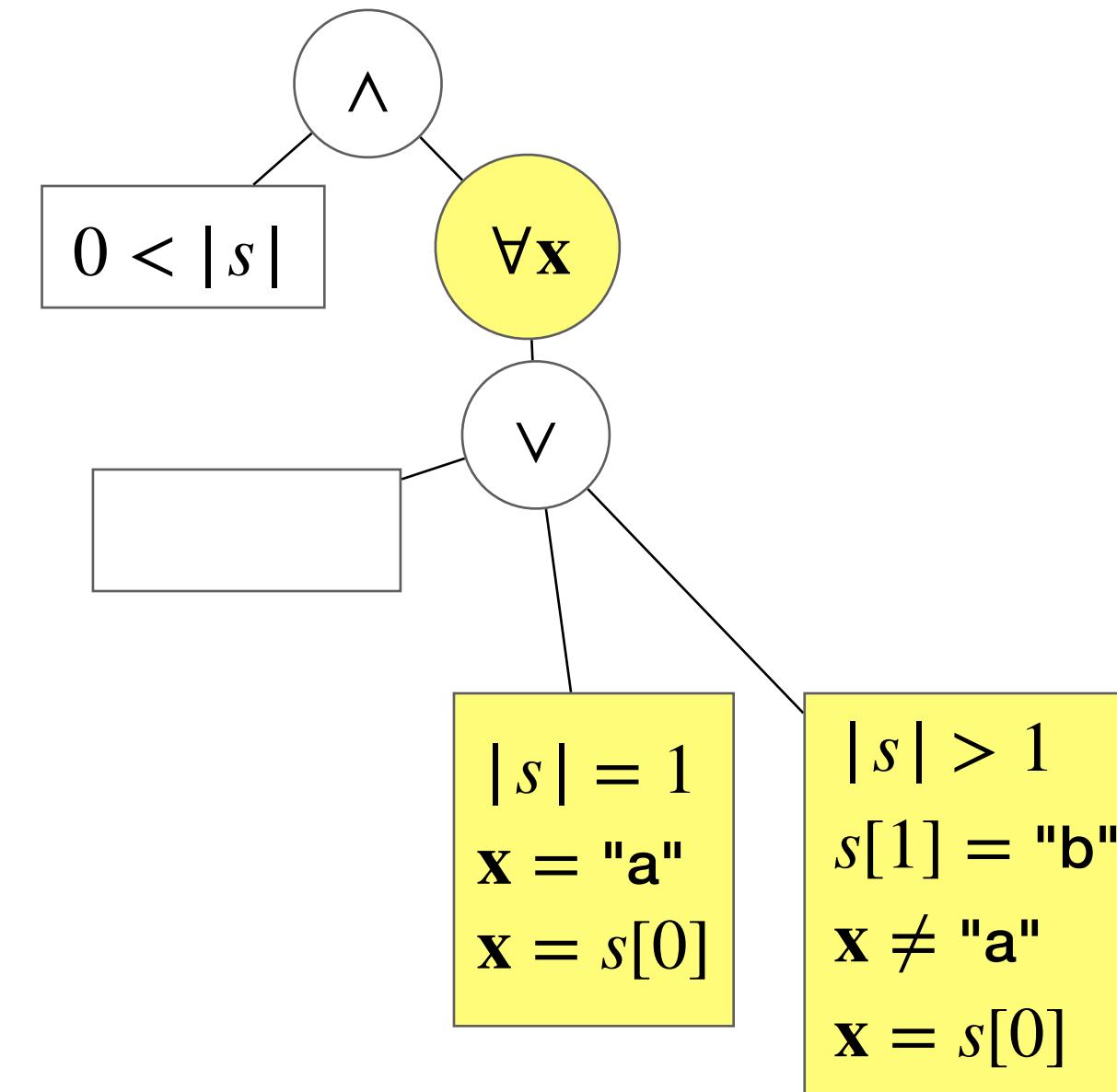
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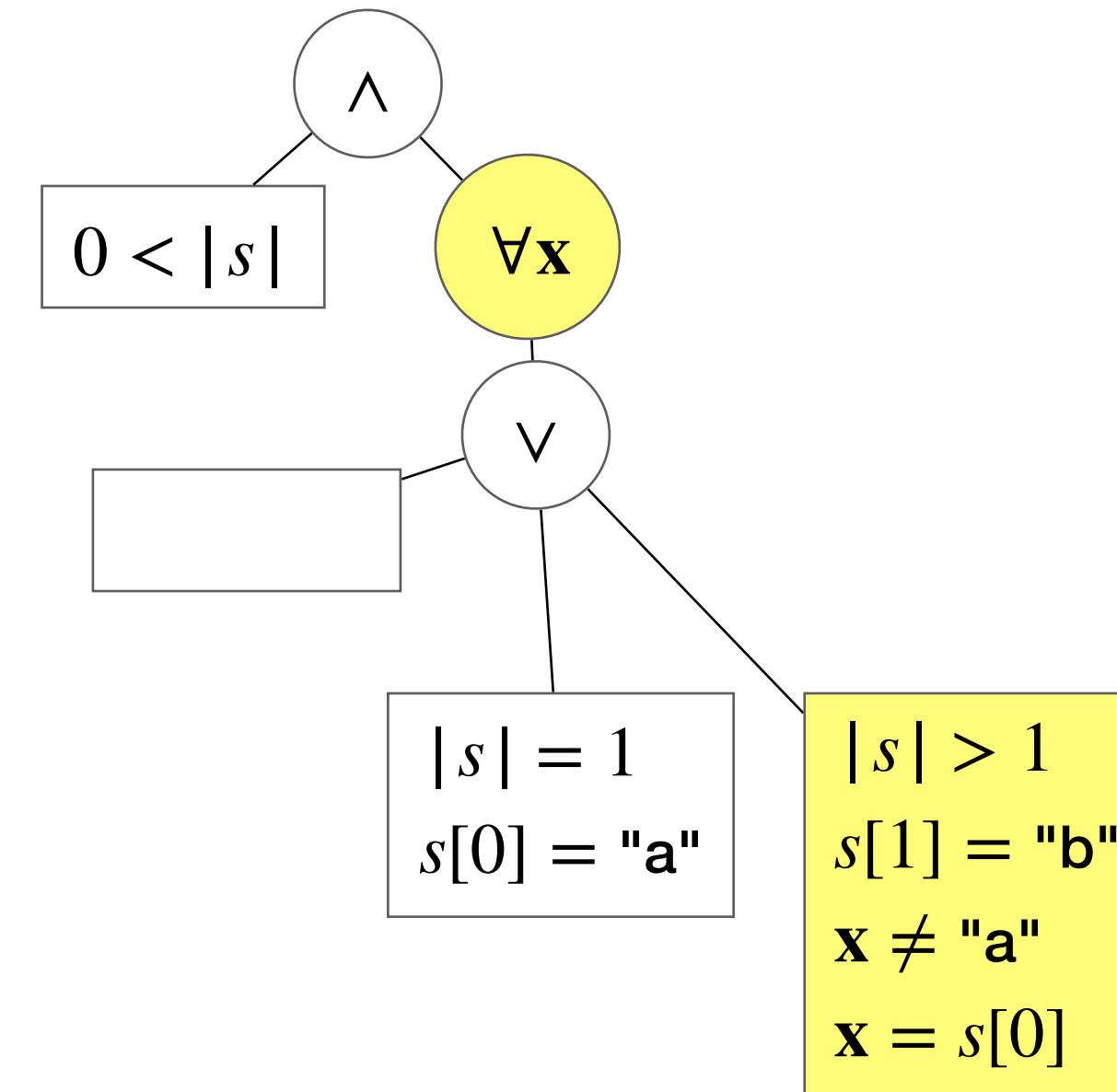
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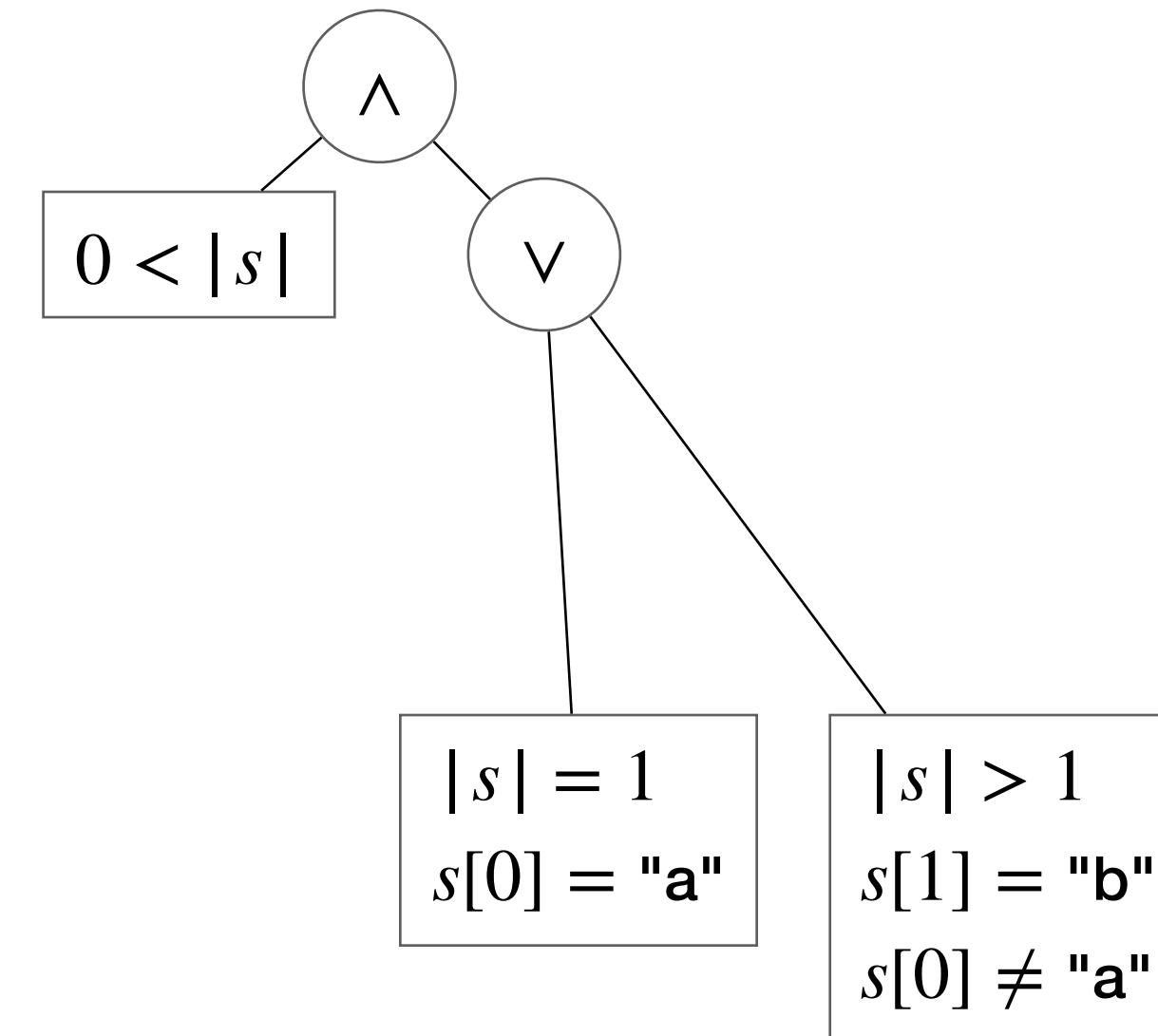
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Grammar Solving

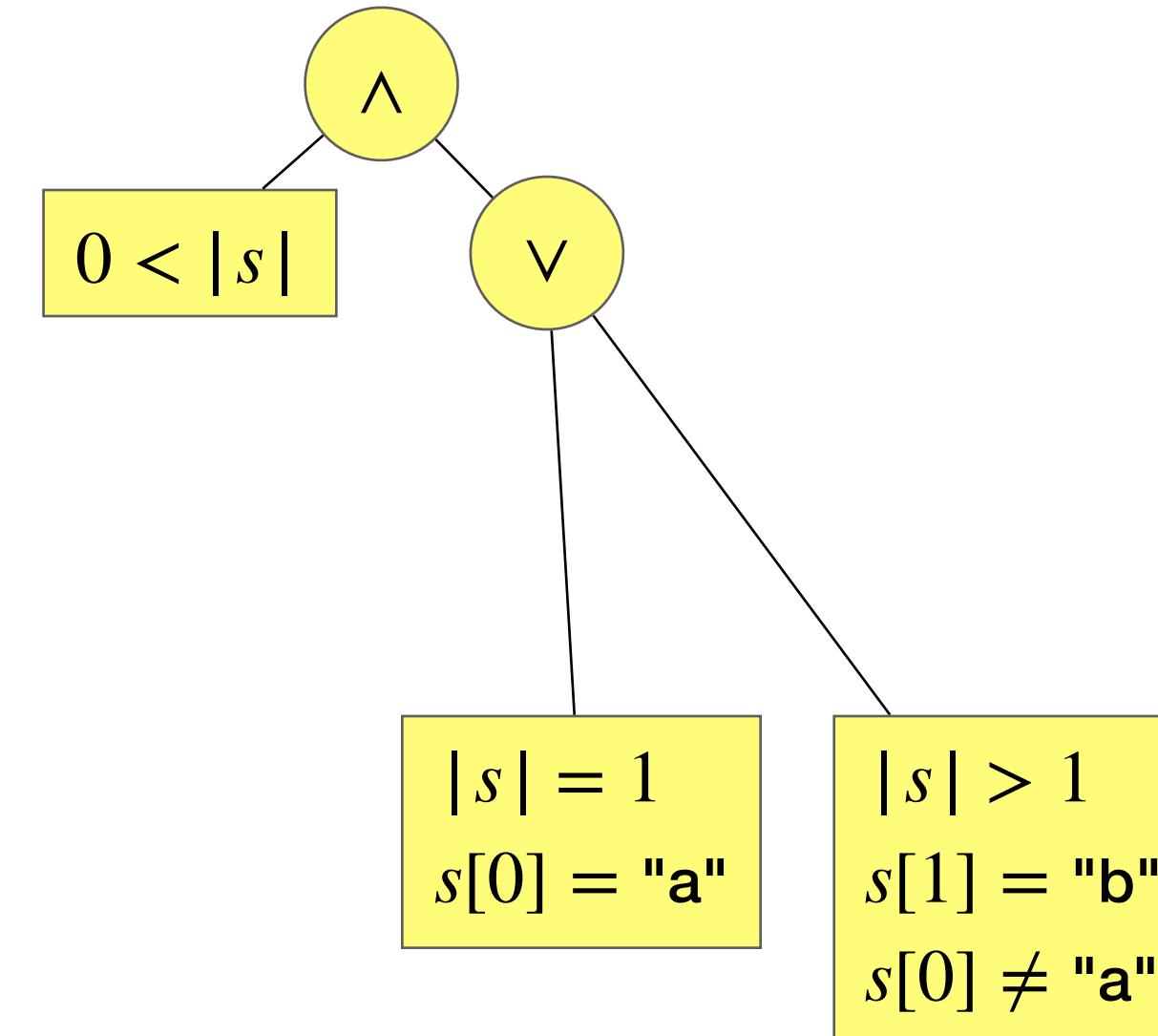
- base solution on “grammar consequent”
- minimize via bottom-up tree rewriting
- apply Boolean equivalences to reach DNF
- eliminate quantifiers by resolving equations
- use (precise) abstract value representations



$\forall x . \varphi \rightarrow \text{resolve } x \text{ in } \varphi$

Grammar Solving

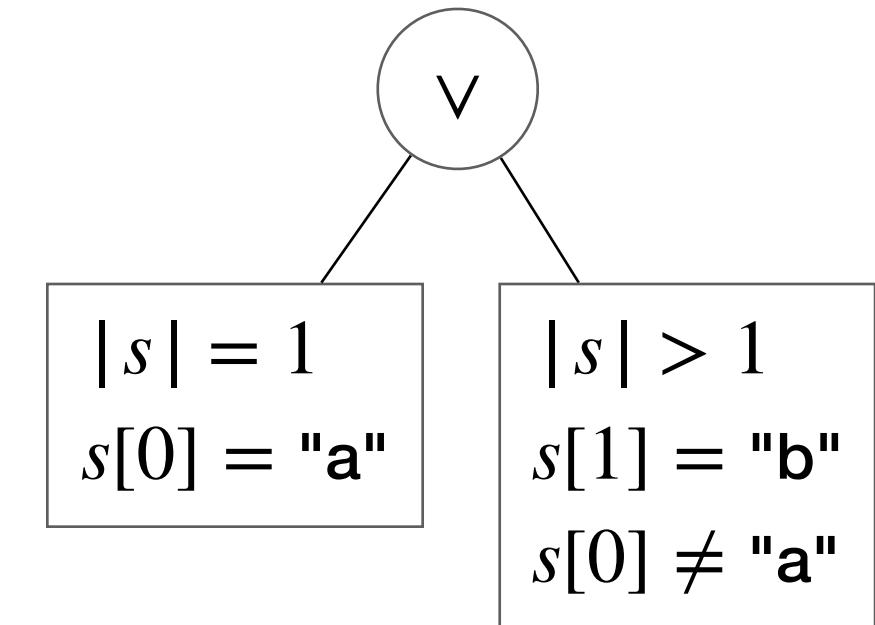
- base solution on “grammar consequent”
- minimize via bottom-up tree rewriting
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- use (precise) abstract value representations



$$a \wedge (b \vee c) \quad \rightarrow \quad (a \wedge b) \vee (a \wedge c)$$

Grammar Solving

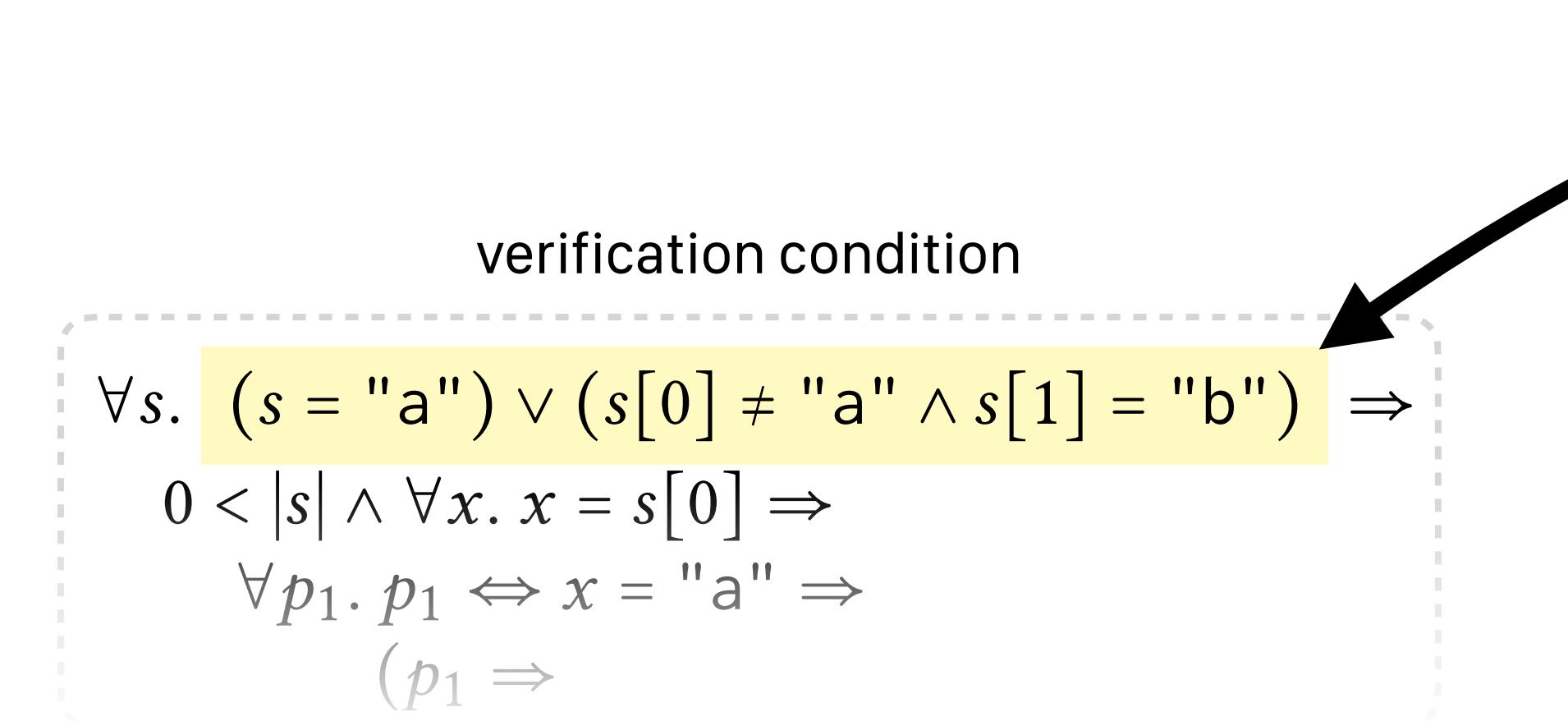
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$$a \wedge (b \vee c) \quad \rightarrow \quad (a \wedge b) \vee (a \wedge c)$$

Enjoy your grammar!

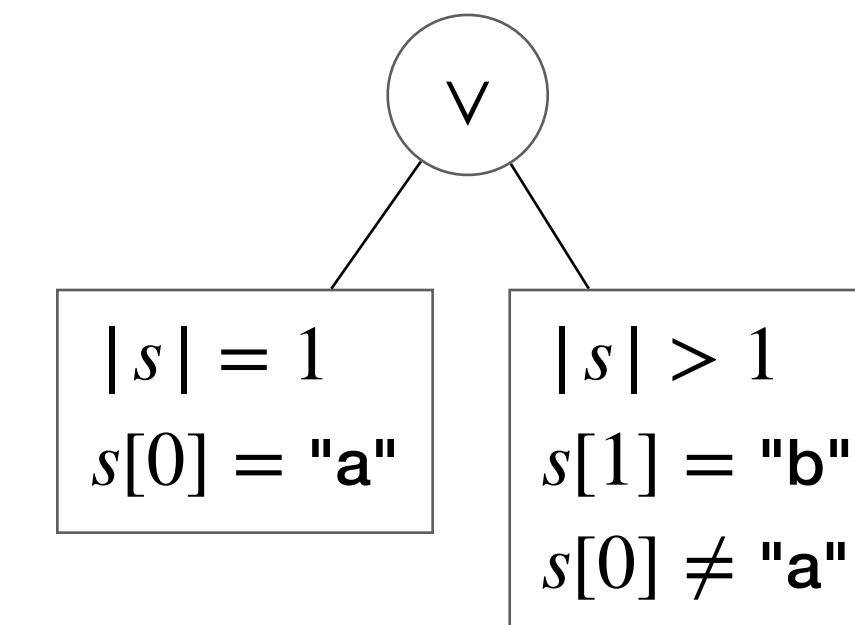
- apply string predicate in verification template to continue type checking
- present grammar to user or applications



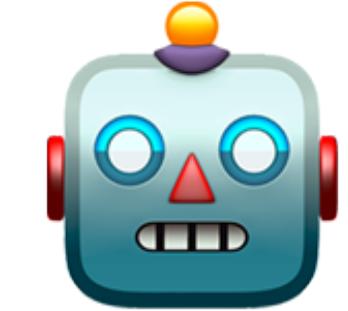
SMT solving

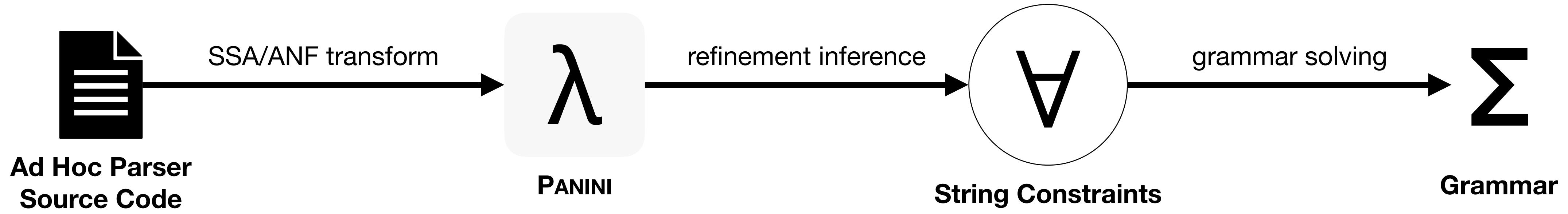


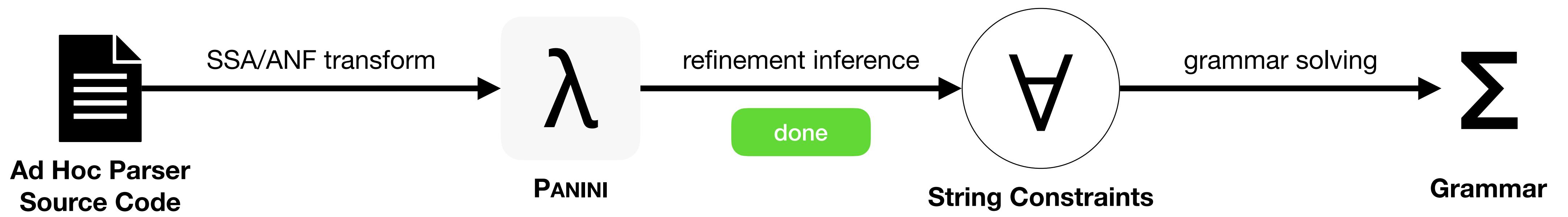
minimal DNF string predicate



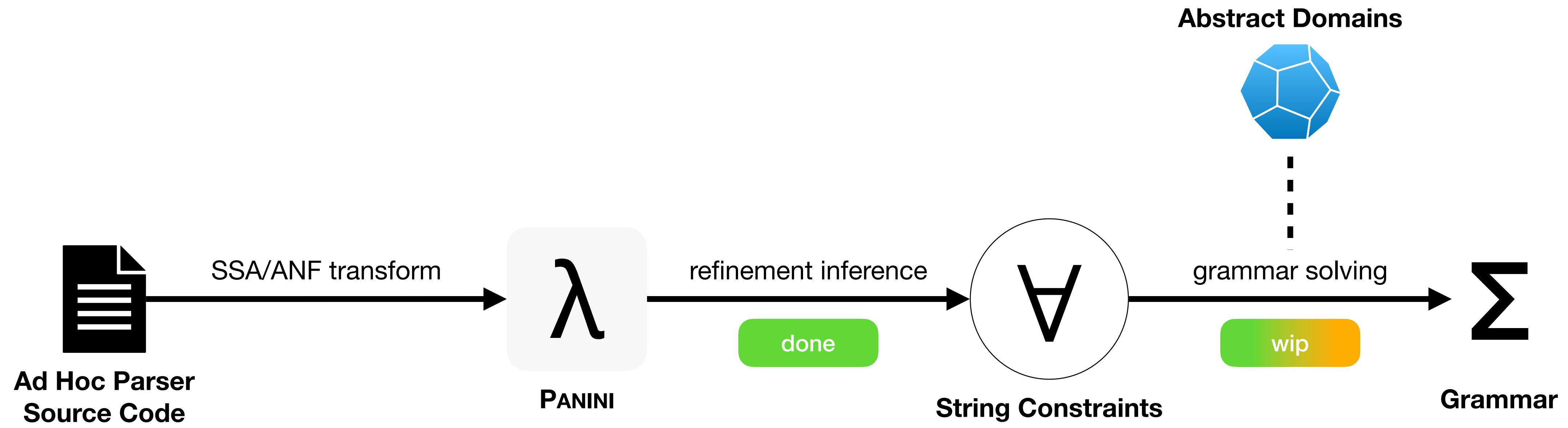
grammar

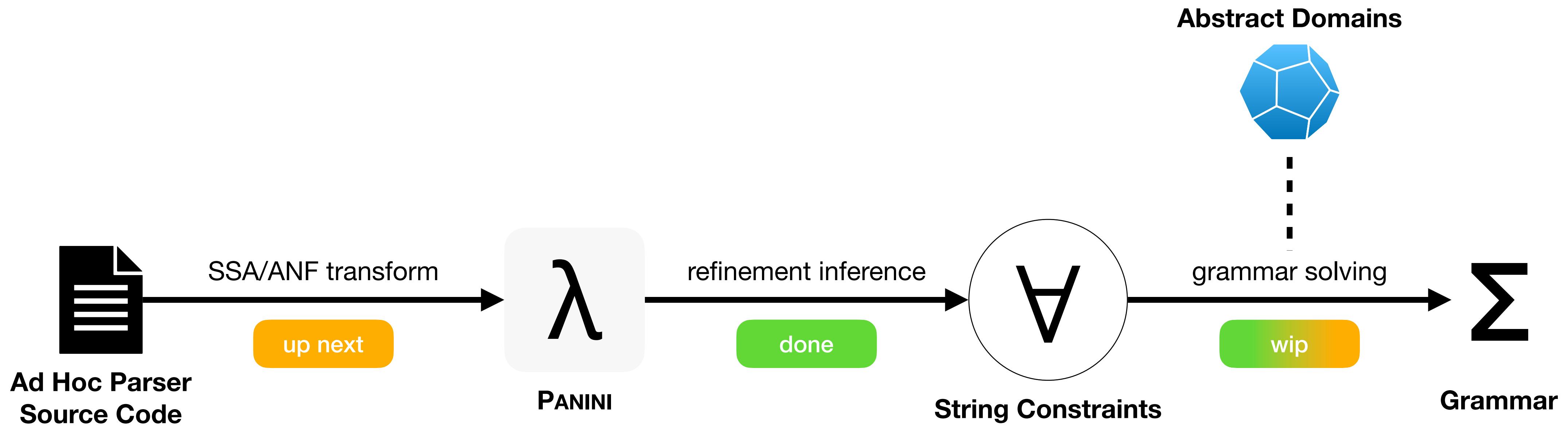
$$s \rightarrow a \mid (\Sigma \setminus a)b\Sigma^*$$




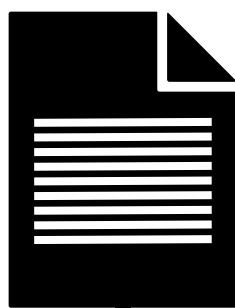








Full Source Code



program slicing



**Ad Hoc Parser
Source Code**

SSA/ANF transform

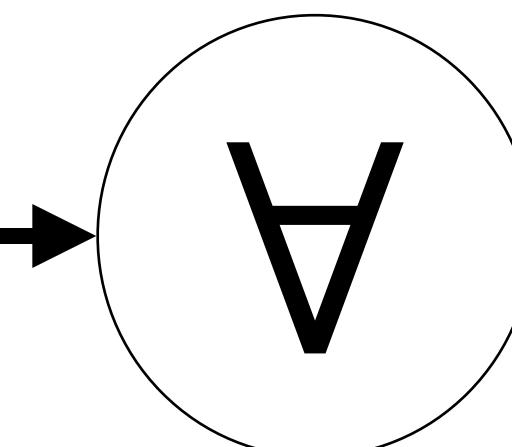
up next



PANINI

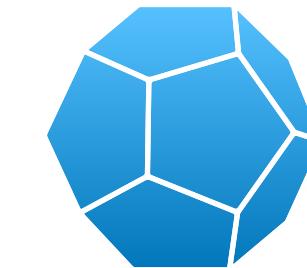
refinement inference

done



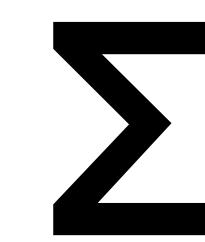
String Constraints

Abstract Domains

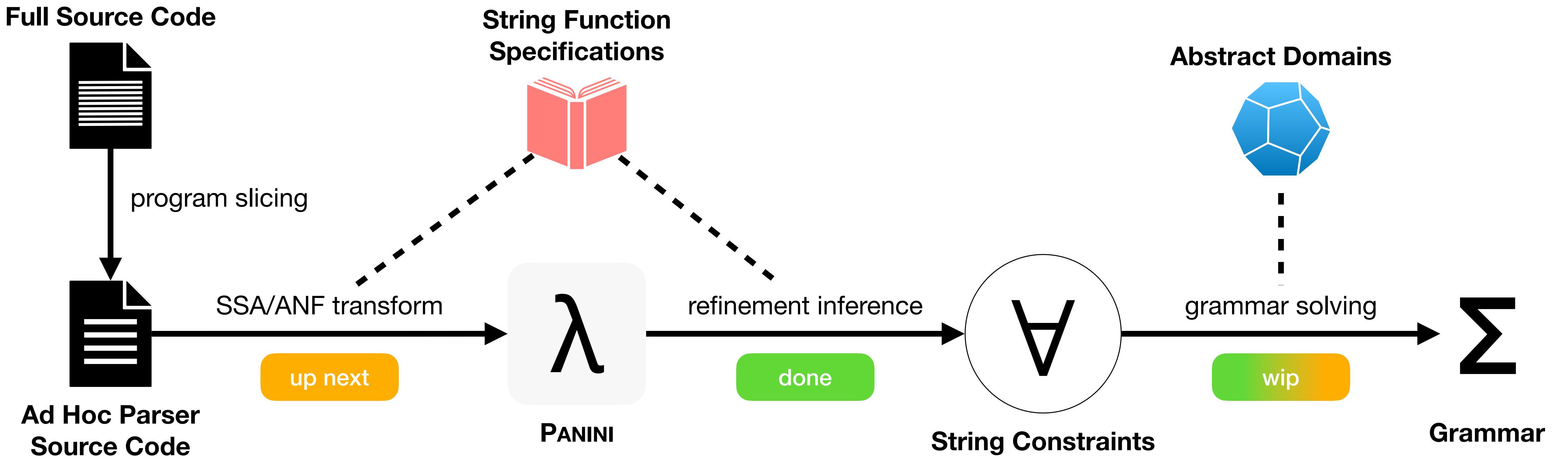


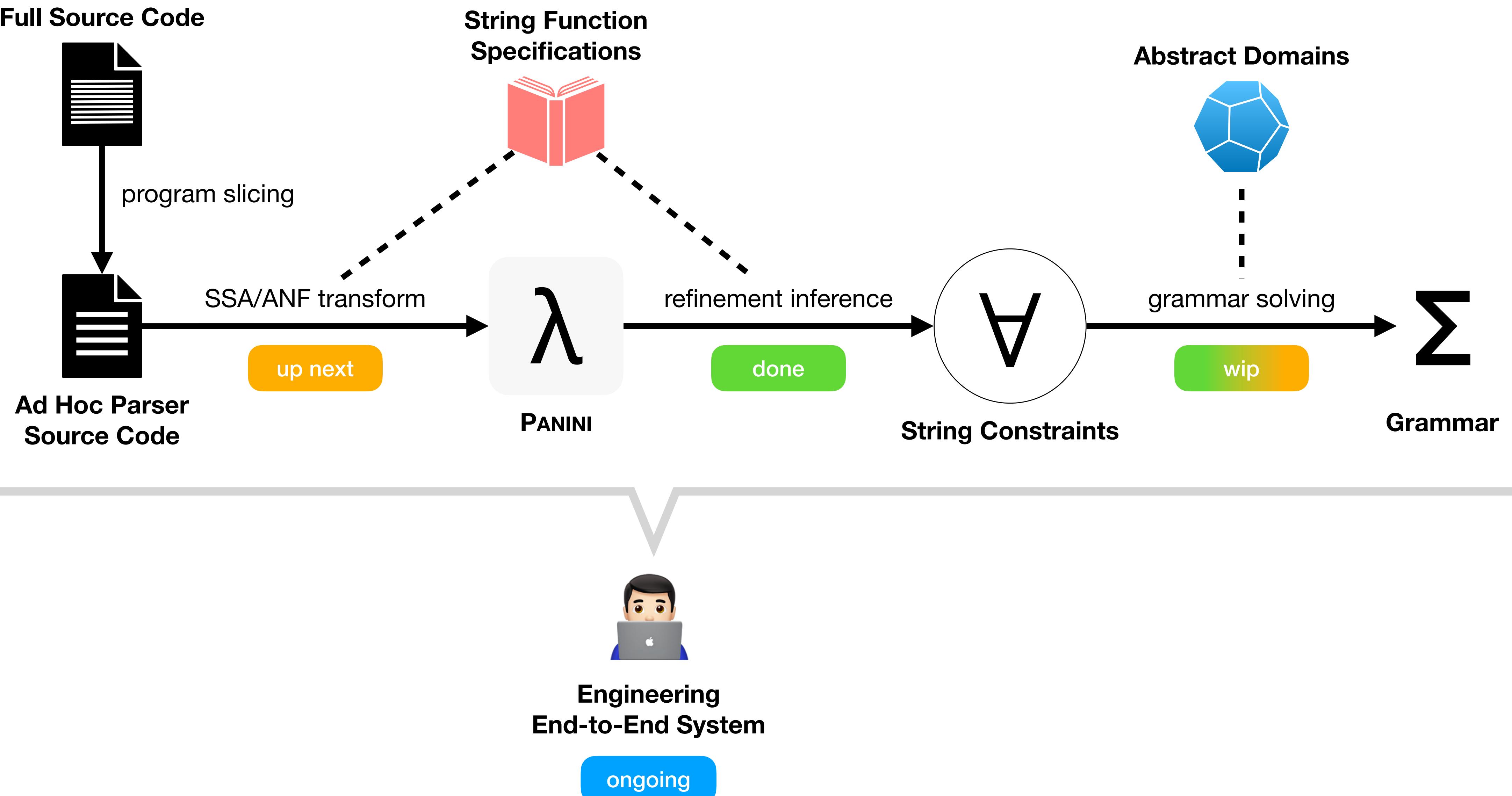
grammar solving

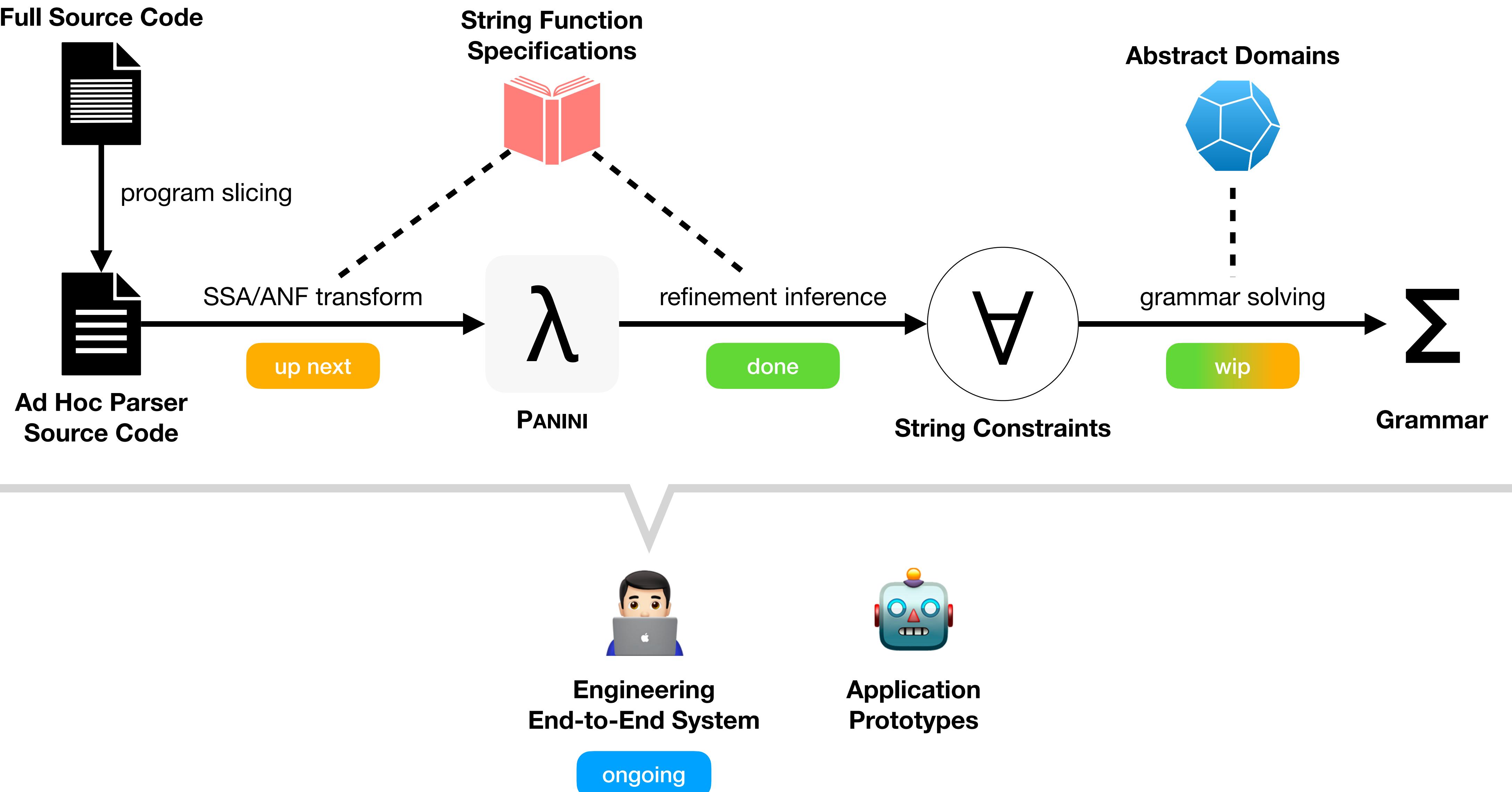
wip

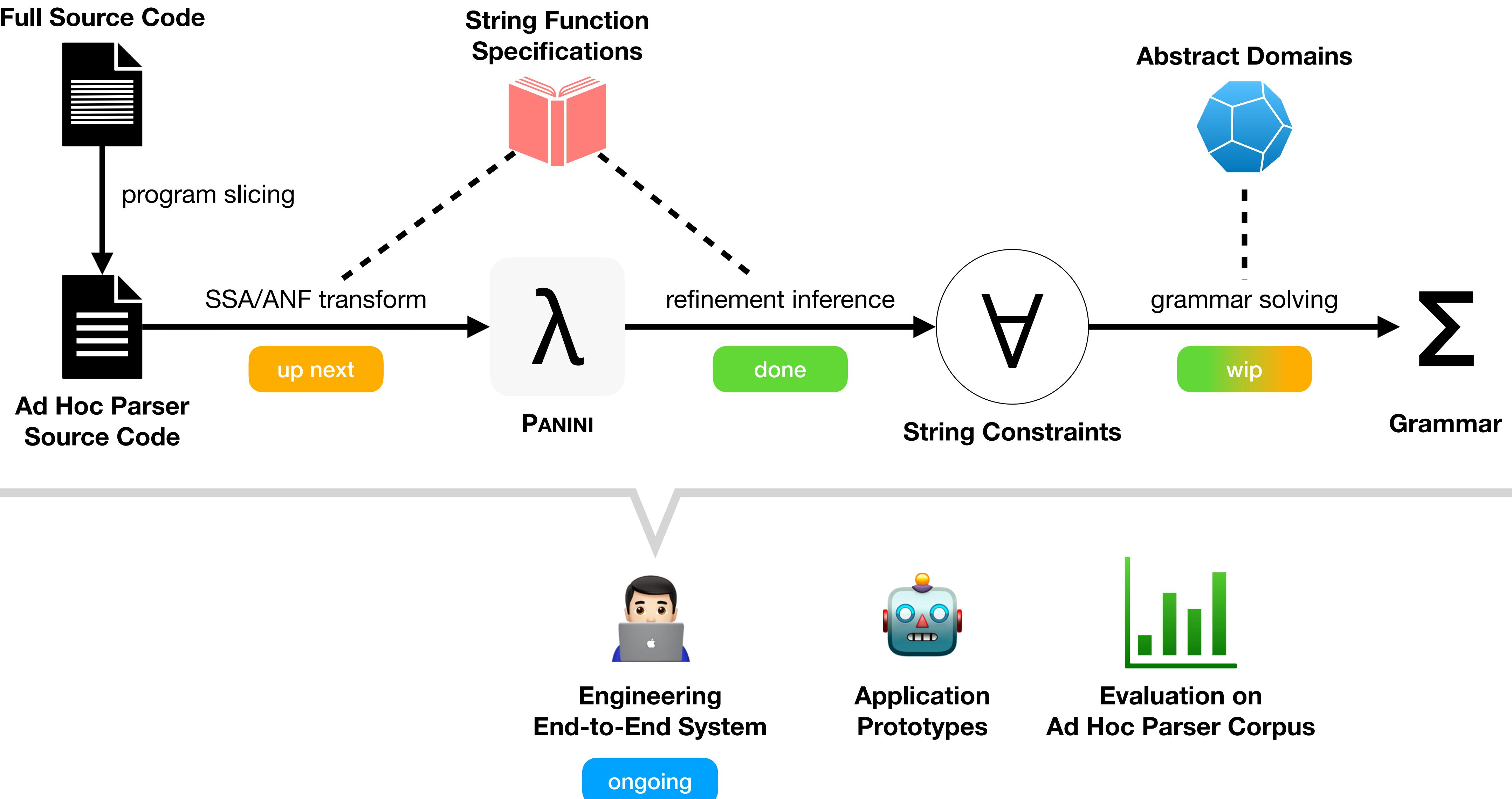


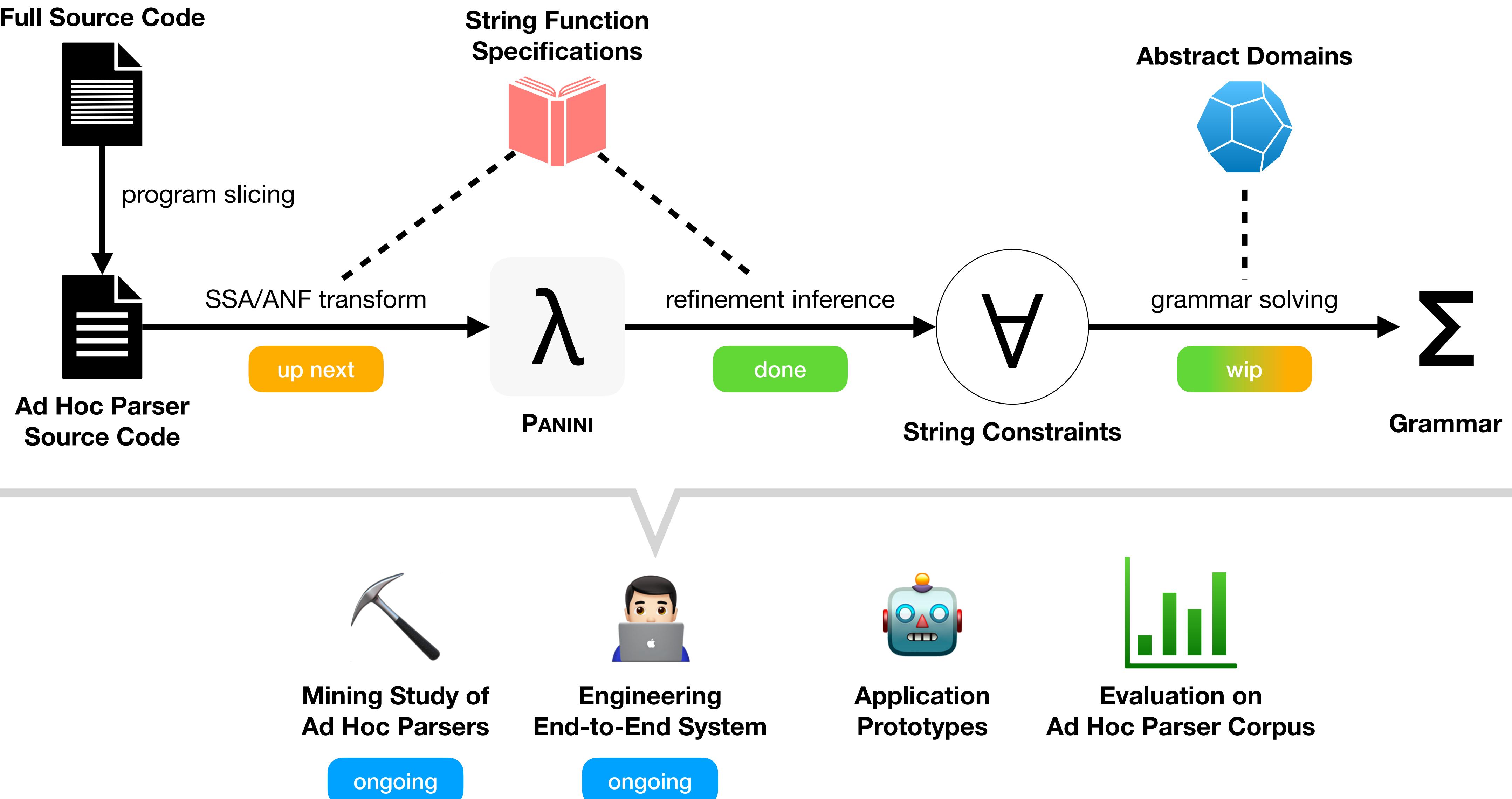
Grammar

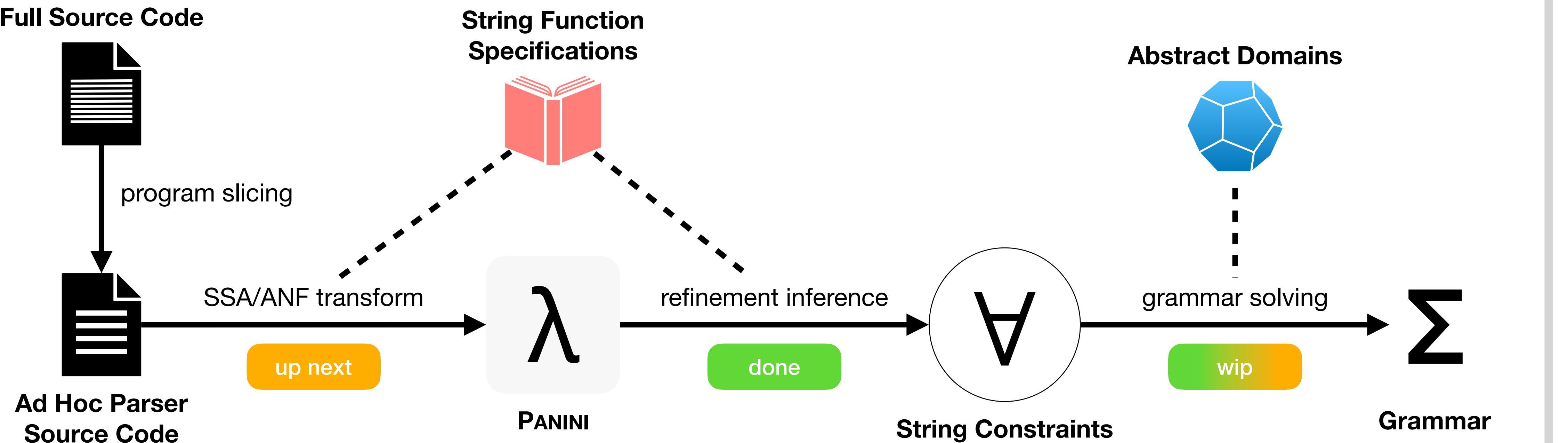












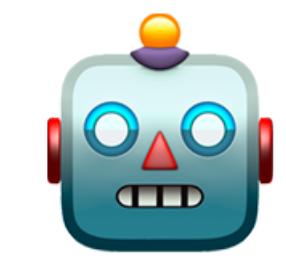
Mining Study of Ad Hoc Parsers

ongoing



Engineering End-to-End System

ongoing



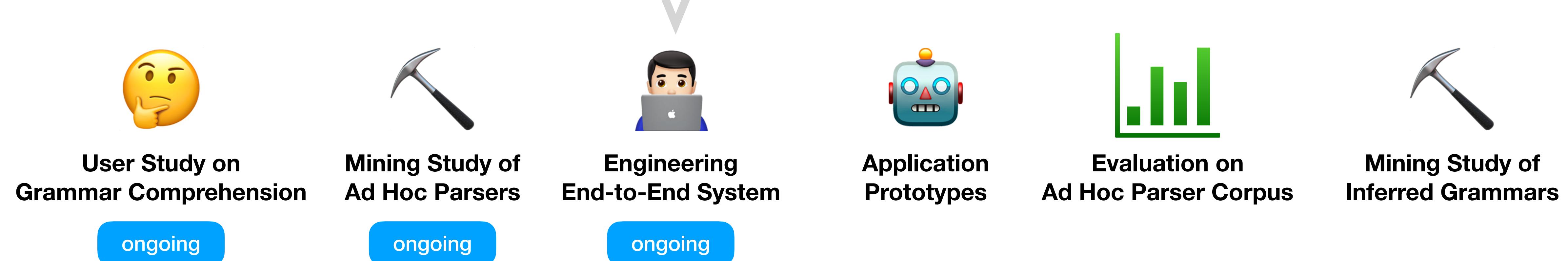
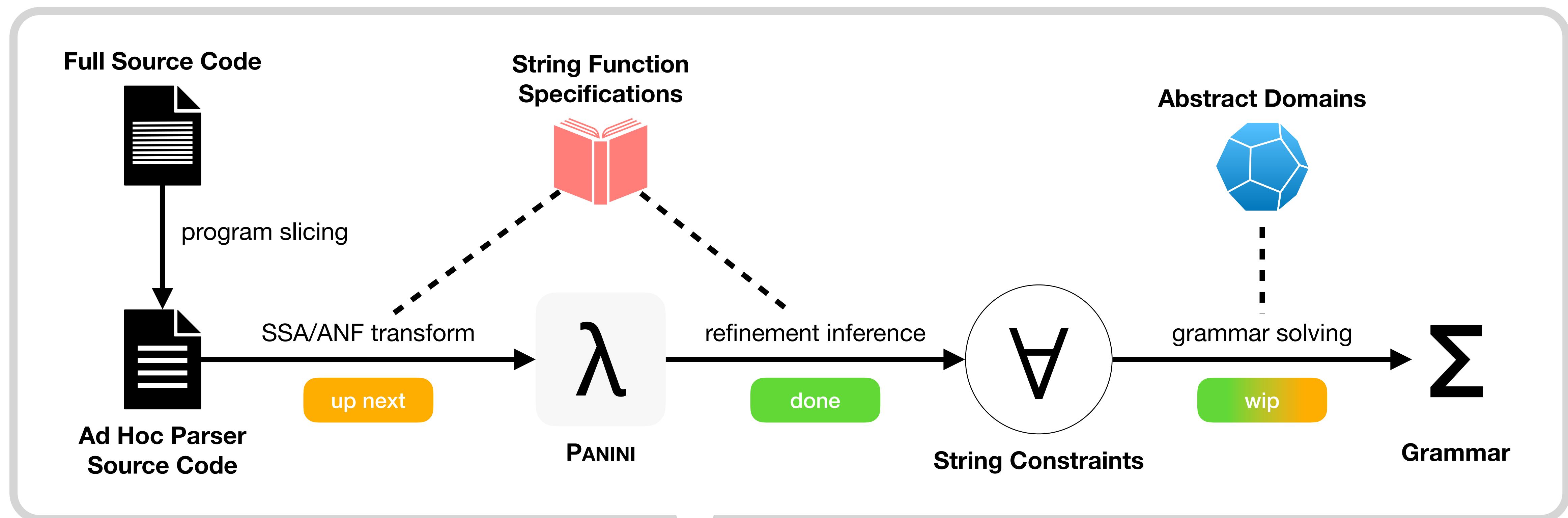
Application Prototypes



Evaluation on Ad Hoc Parser Corpus

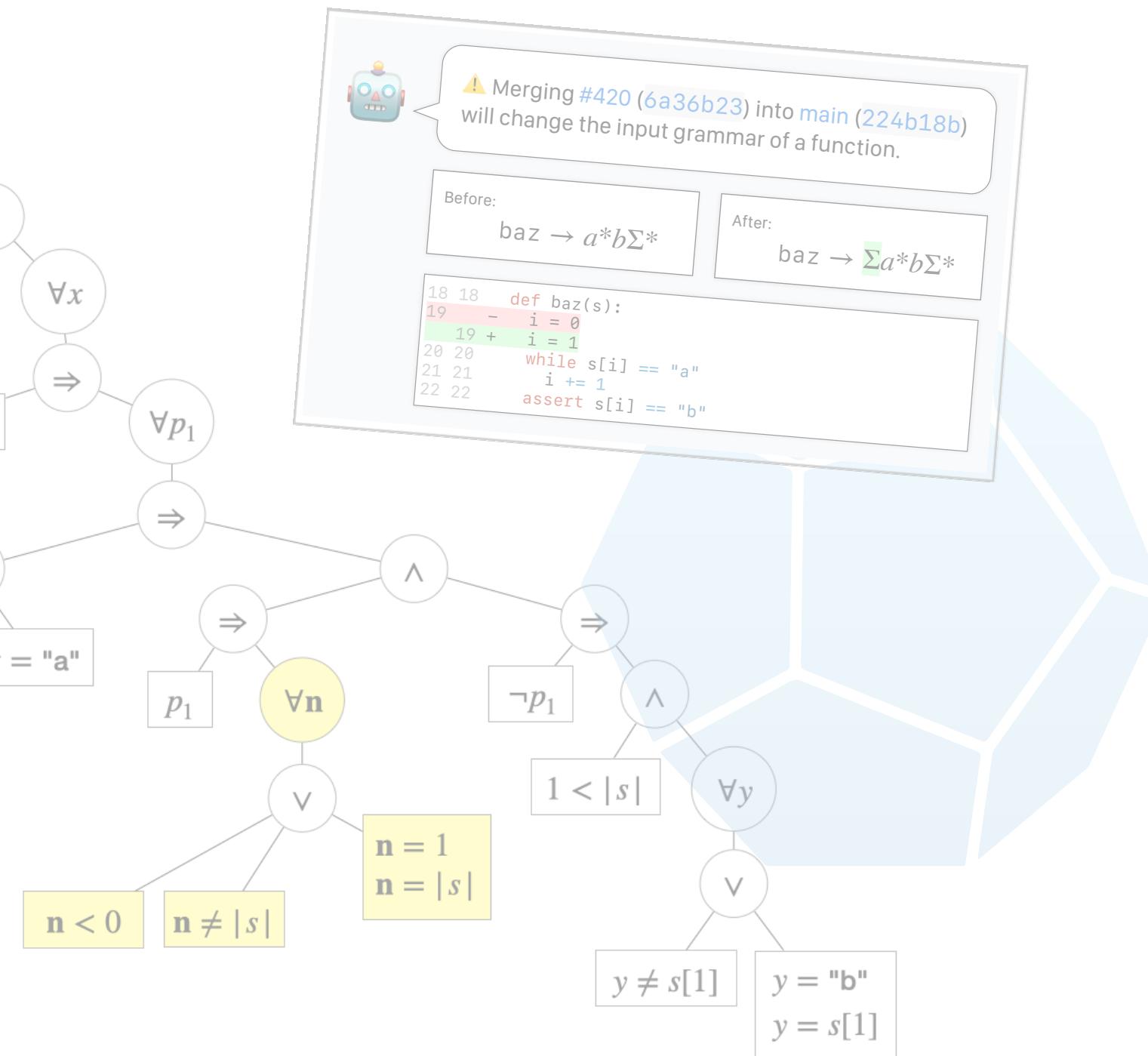


Mining Study of Inferred Grammars



Grammar Inference for Ad Hoc Parsers

<https://mcschroeder.github.io/#splash2022>

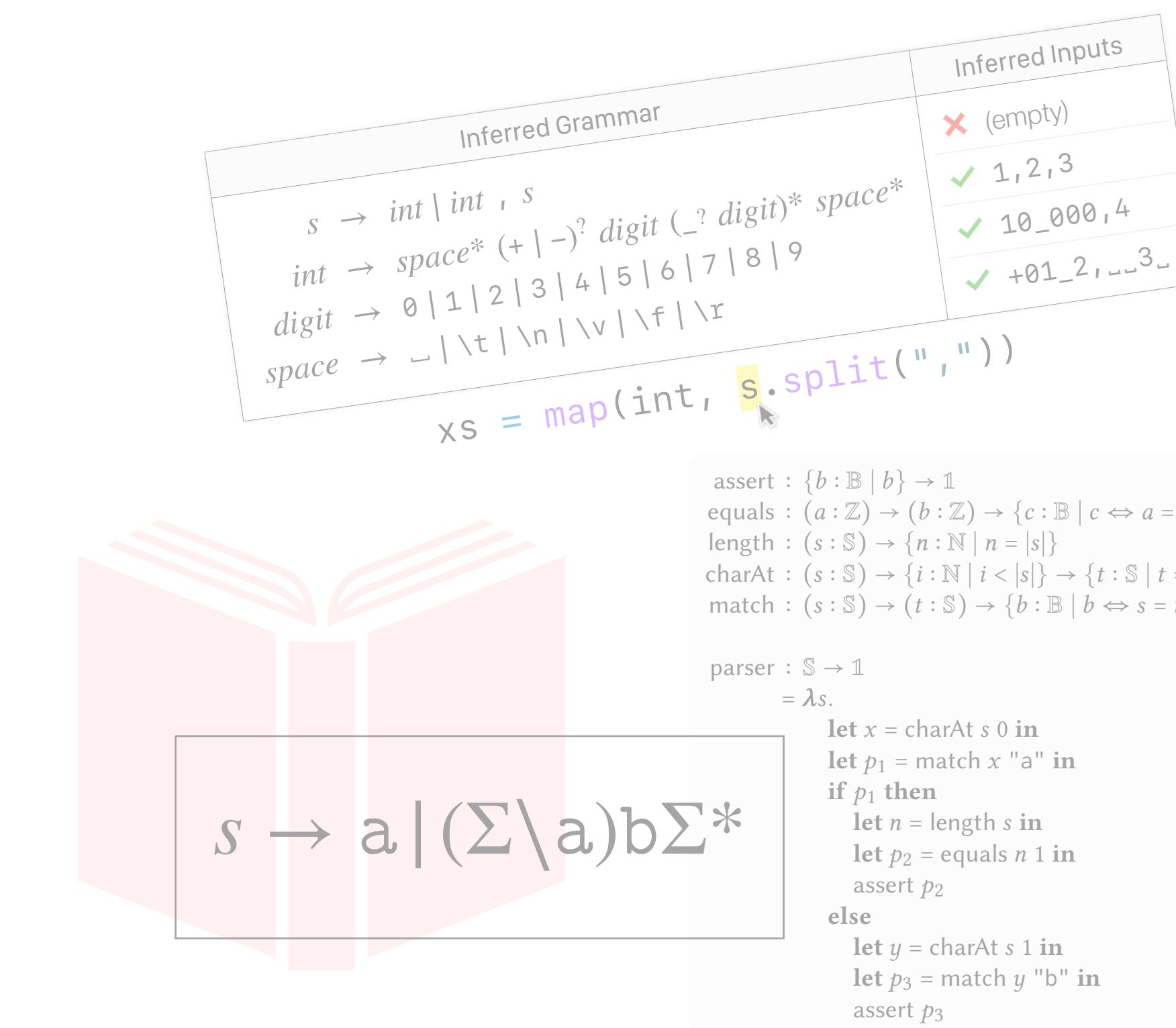


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Doctoral Symposium, SPLASH 2022

Tāmaki Makaurau, Aotearoa
Auckland, New Zealand



Informatics