

# COMP 410 Lecture 1

Kyle Dewey

# About Me

- I research automated testing techniques and their intersection with CS education
- My dissertation used logic programming extensively
- This is my second semester at CSUN
- First time dedicating a whole course to logic programming

# About this Class

- See something wrong? Want something improved? Email me about it!  
([kyle.dewey@csun.edu](mailto:kyle.dewey@csun.edu))
- I generally operate based on feedback

# Bad Feedback

- This guy sucks.
- This class is boring.
- This material is useless.

-I can't do anything in response to this

# Good Feedback

- This guy sucks, *I can't read his writing.*
- This class is boring, *it's way too slow.*
- This material is useless, *I don't see how it relates to anything in reality.*
  
- I can't fix anything if I don't know what's wrong

-I can actually do something about this!

# What is Logic Programming?

- Major programming paradigm – a way of thinking about problems
- Emphasizes thinking about exactly what the problem is, as opposed to exactly how to solve it. This is called declarative programming.
- For example: it's generally easier to say what constraints must hold for a valid Sudoku solution, as opposed to directly finding a valid Sudoku solution.
- Somewhat related to functional programming – we generally lack mutable state
- Unlike any other major paradigm, the distinction between inputs and outputs is intentionally blurred. You can take advantage of this.
- Basis in formal logic. It's the only major paradigm where “=” has the same meaning as it does in math.

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# What is this Course?

- Strong emphasis on programming and using logic programming languages
- I want you to think in this paradigm, not merely force Java into it
- The ideas can be applied in non-logical languages, and your first assignment will force you to write in a logical way outside of a logic programming language (though you won't realize that's what you're doing yet)
- Little bit of theory

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- Applying logic programming without a logic programming language
- Little bit of theory later on

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---

- Artificial intelligence

–"Artificial intelligence" used to refer to search techniques, which is relevant to logic programming. Now the term largely refers to machine learning. What it means is a moving target.

–Machine learning (we won't do any sort of statistics)

–You can spend a career on the theory behind this stuff. I know some, but it's not my speciality.

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- Machine learning
- Deeply theoretical

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# Syllabus

# Outline

- Abstract Syntax Trees and evaluation
- SAT and Semantic Tableau

# Abstract Syntax Trees and Evaluation

# Abstract Syntax Tree

- Abbreviation: AST
- Unambiguous tree-based representation of a sentence in a language
- Very commonly used in compilers, interpreters, and related software

-Generally we work with ASTs instead of Strings or any other code representation

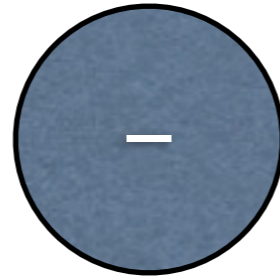
$$(1 + 2) - 3 * 4$$

-Key parts: we need parentheses to direct that  $1 + 2$  happens first. We know that the  $3 * 4$  should happen after the part in parentheses from PEMDAS rules



$$(1 + 2) - 3 * 4$$

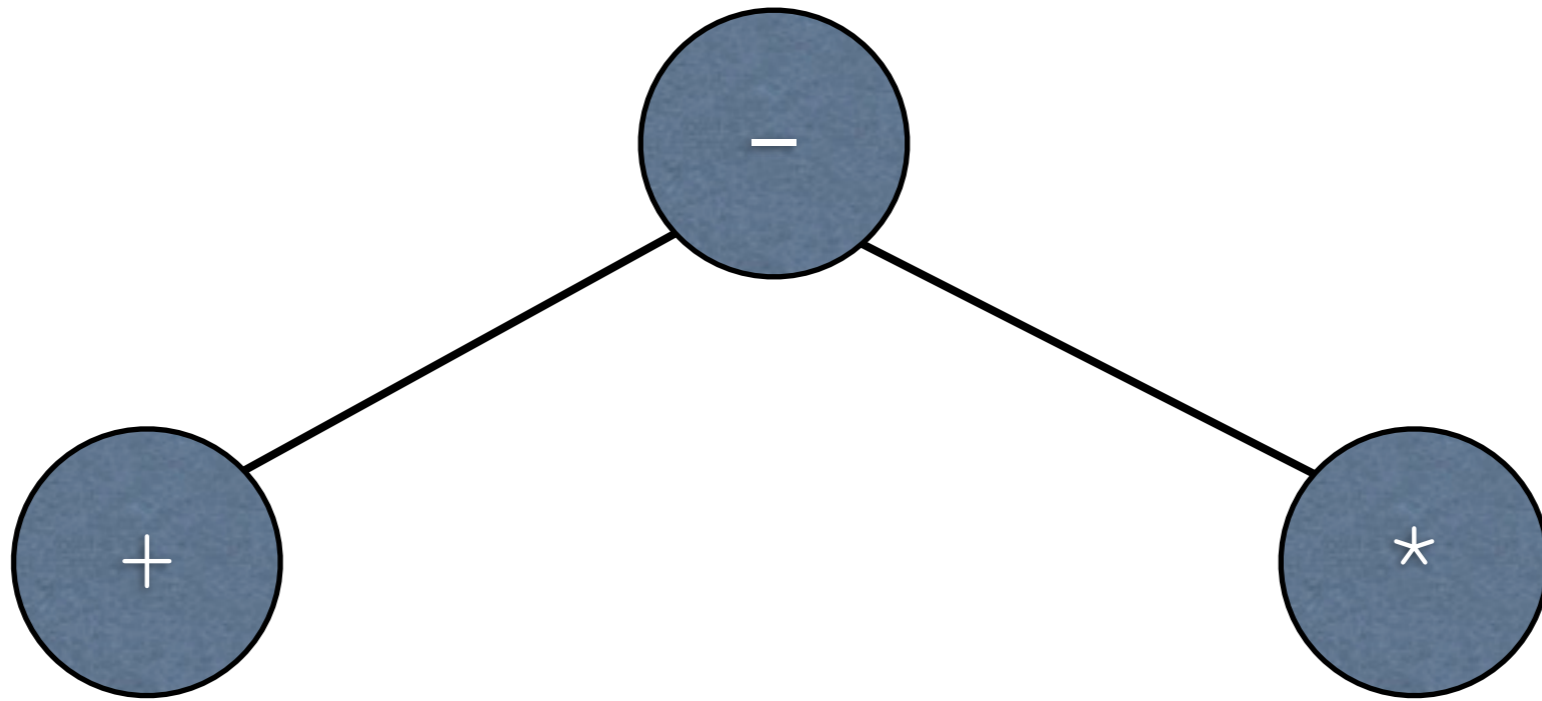
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-Lowest priority thing ends up in the top of the tree

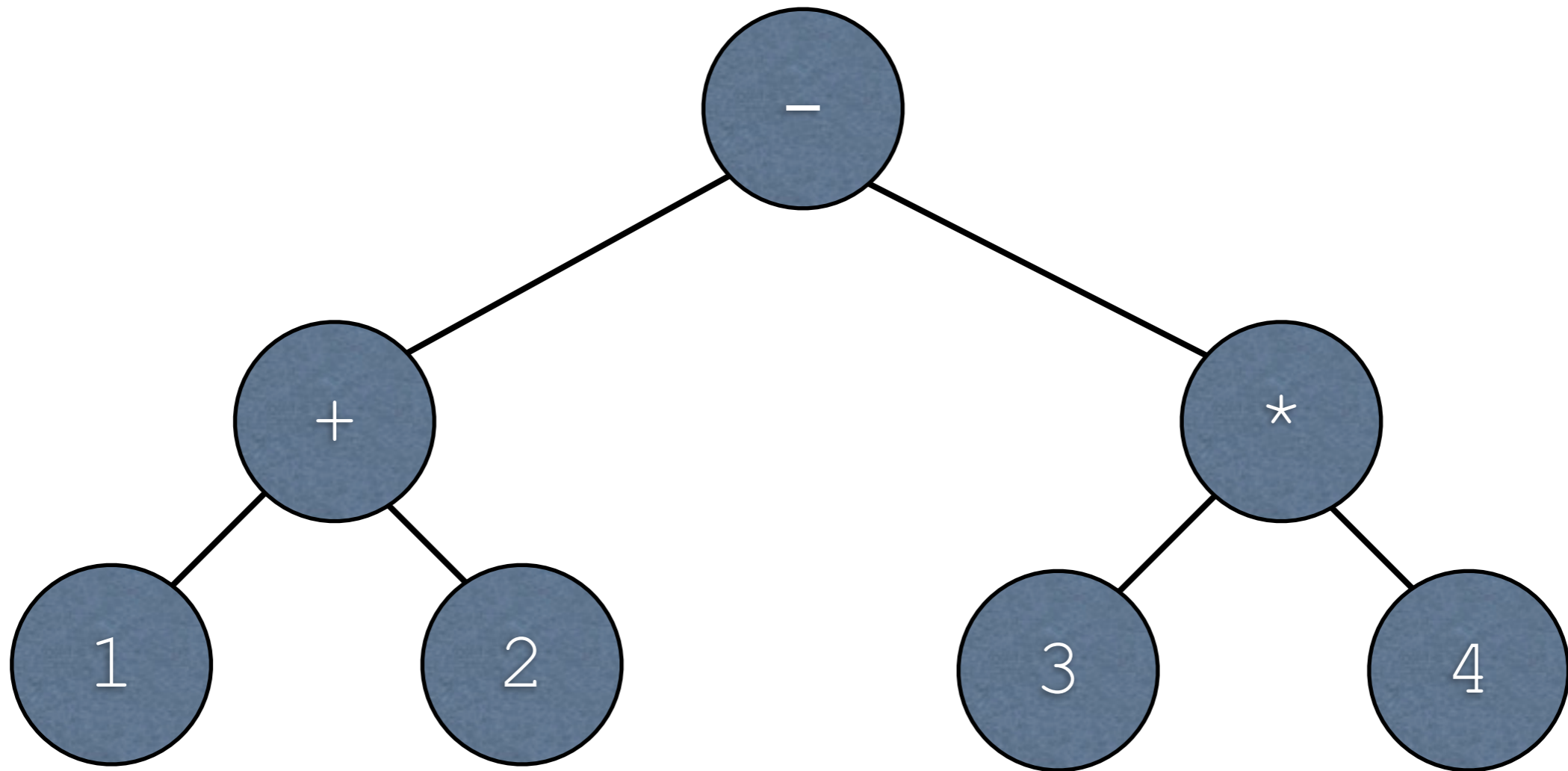
$(1 + 2) - 3 * 4$

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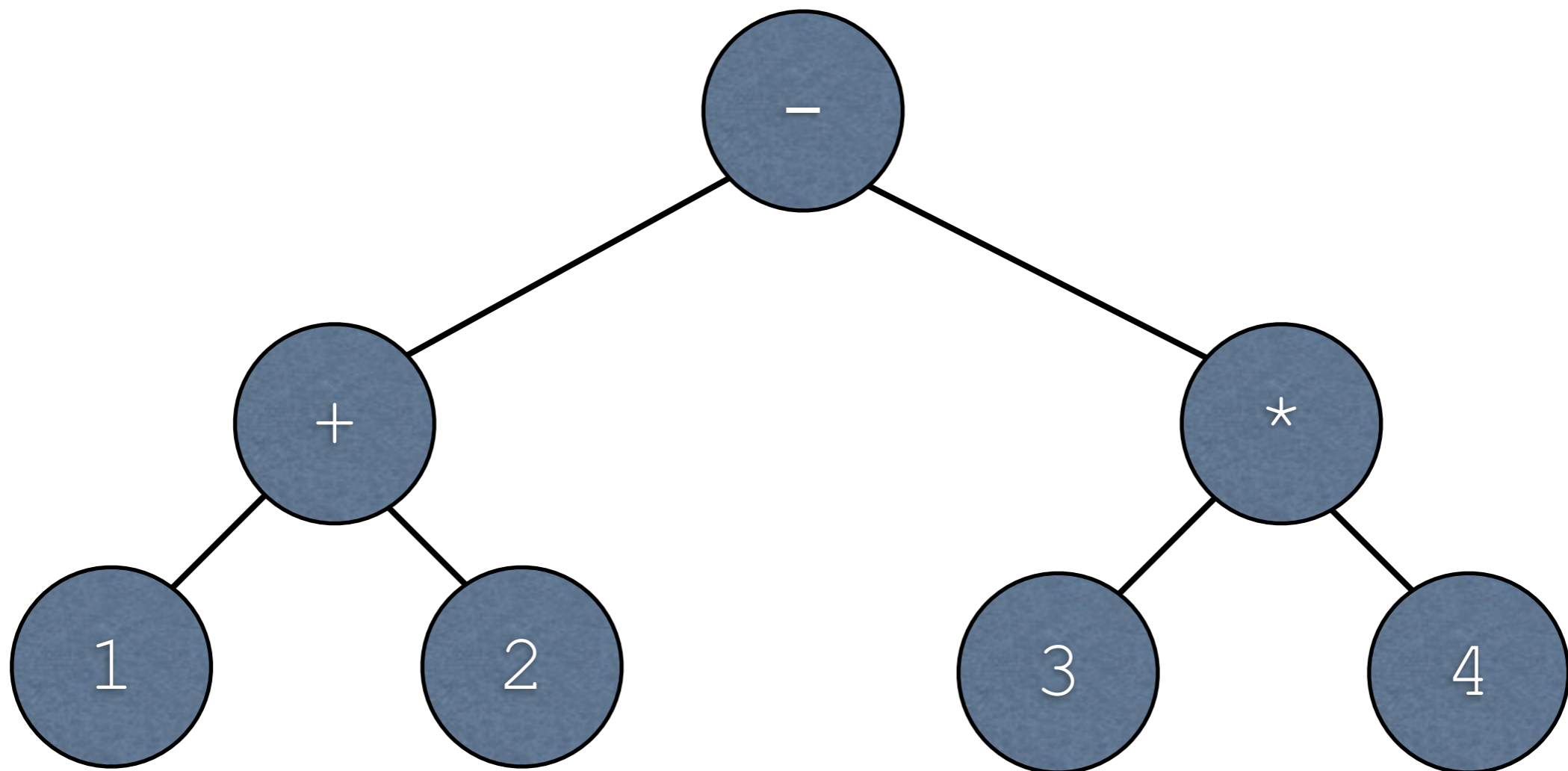
-Next level of priority

$(1 + 2) - 3 * 4$



-Next level of priority

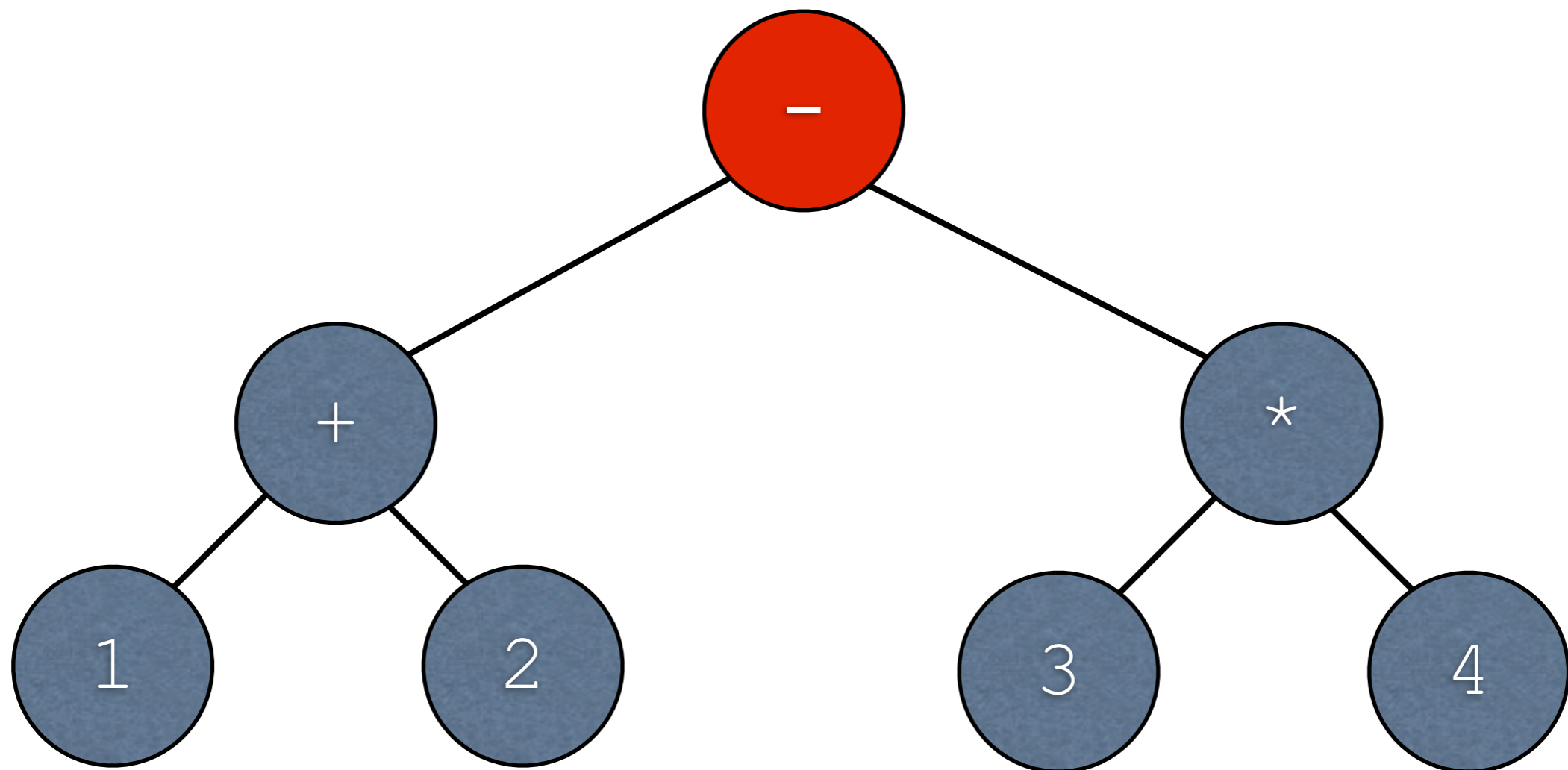
# Evaluation



-Key point: bubble-up values from the leaves

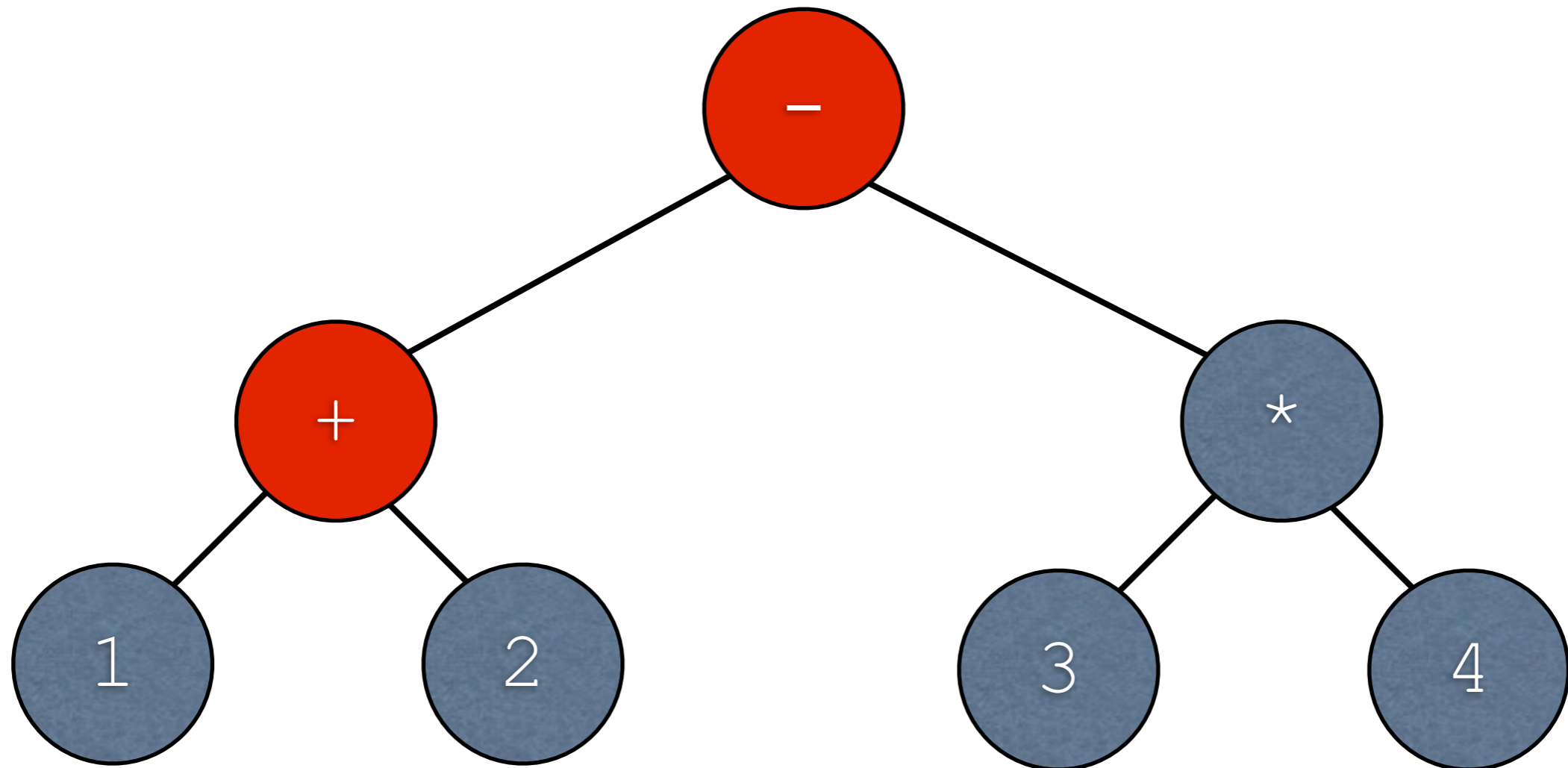
-This can be implemented in code via a recursive function starting from the root (code in a bit later)

# Evaluation



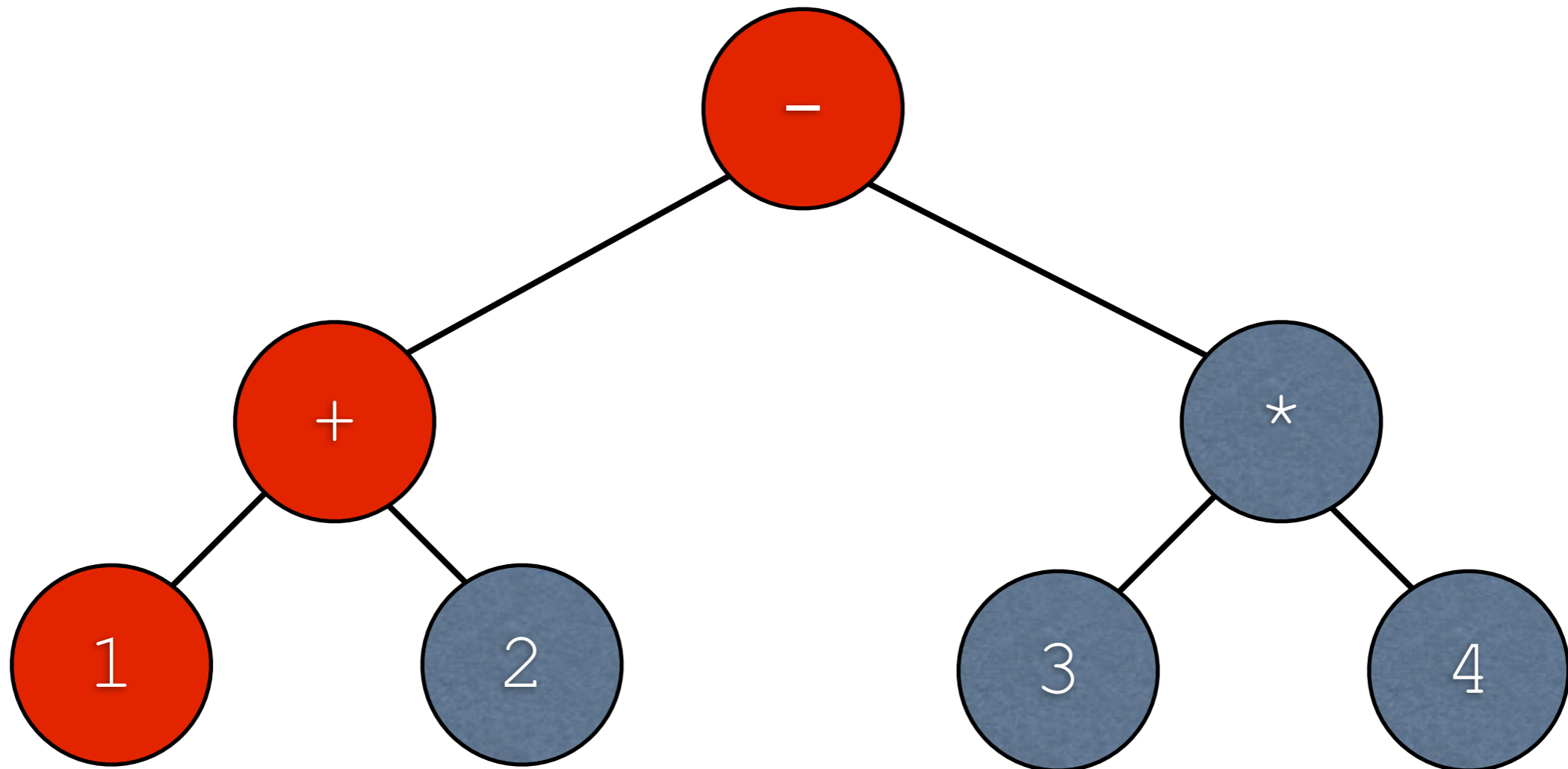
-We start evaluation from the root...

# Evaluation



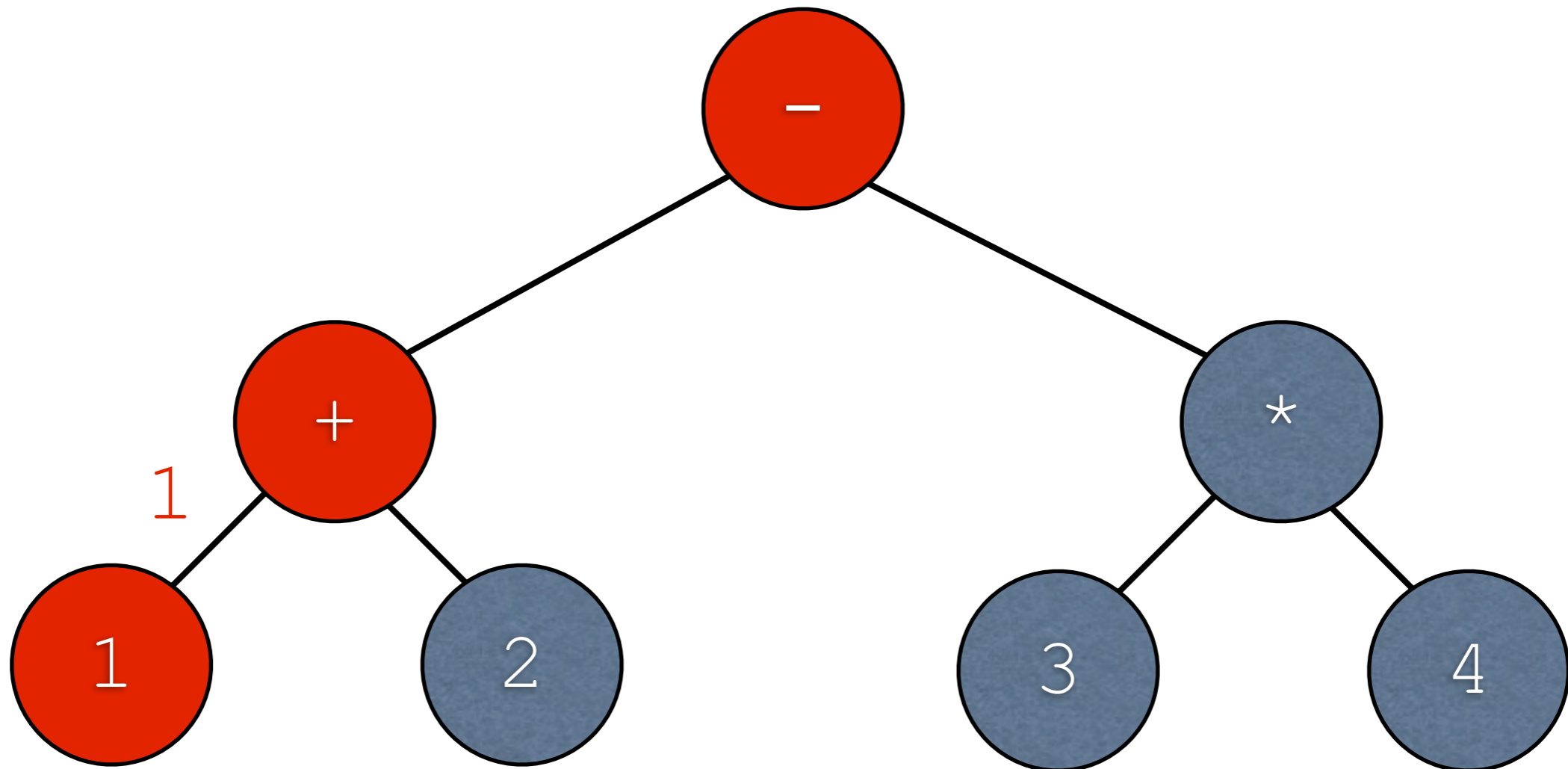
-In order to evaluate the root, we need to evaluate the left subtree of the root (+)

# Evaluation



-In order to evaluate +, we need to evaluate the left subtree (as with the root)

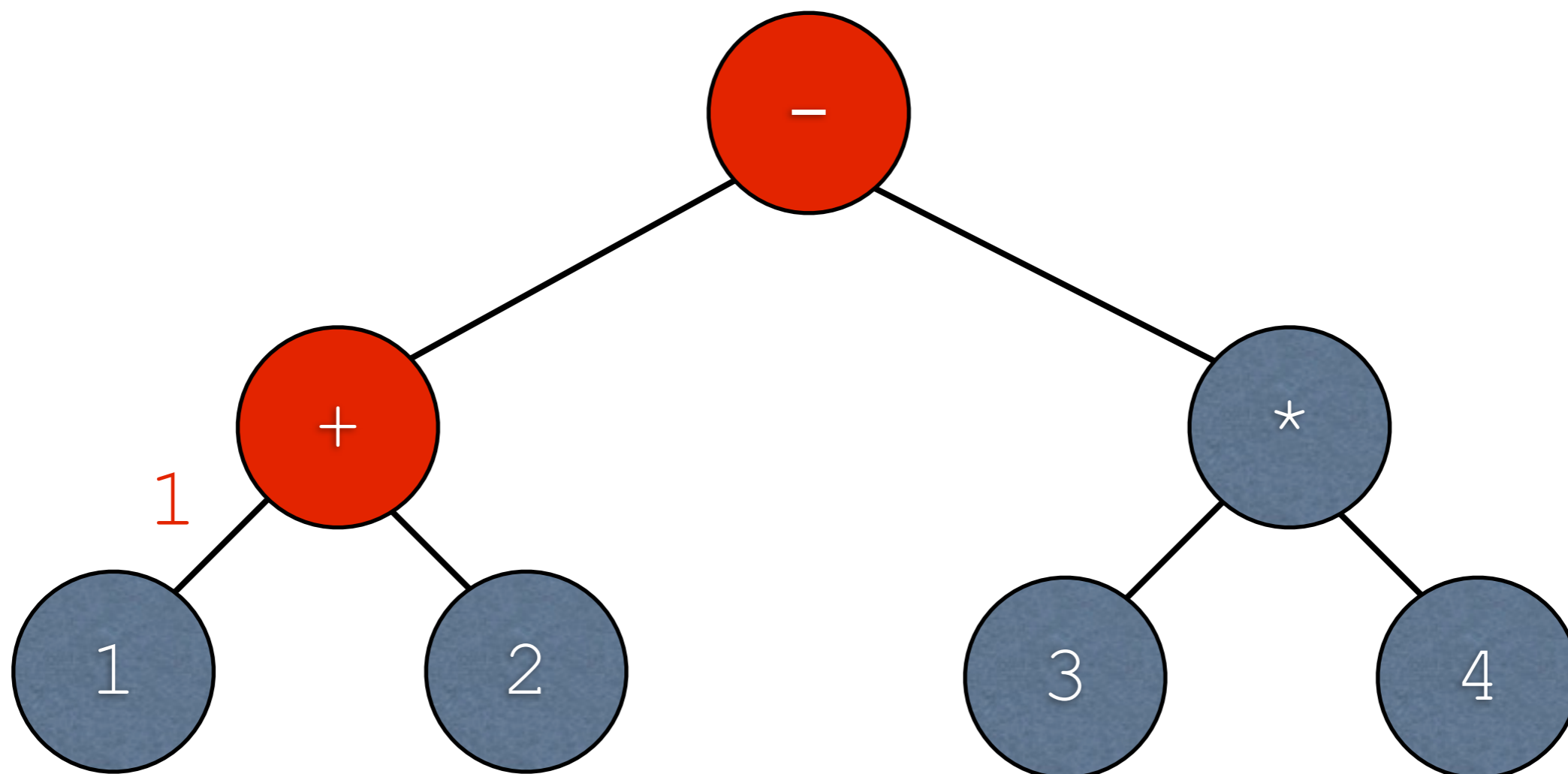
# Evaluation



- For arithmetic, leaves are simply numbers
- Evaluating a leaf returns the number held within

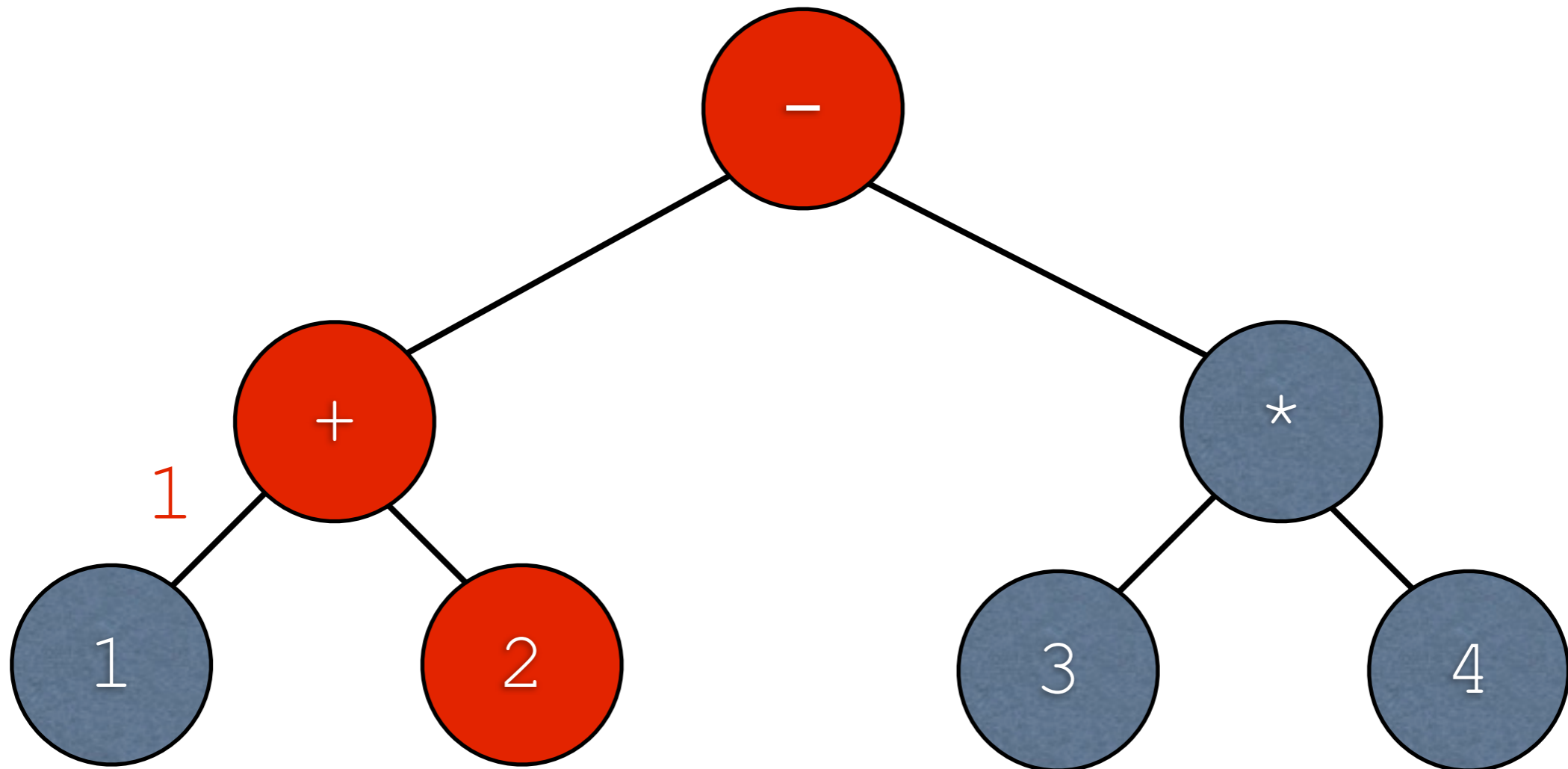


# Evaluation



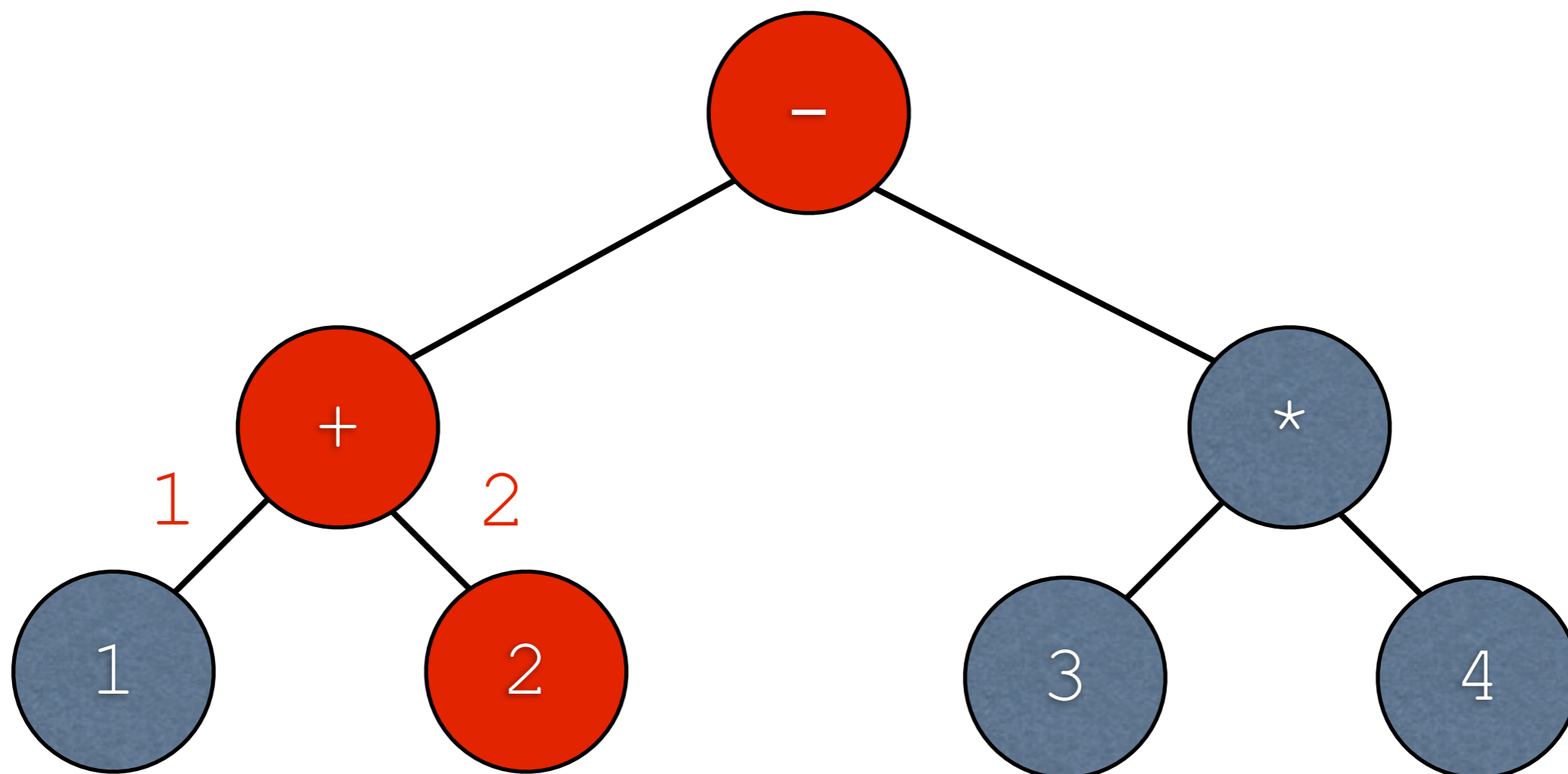
- The left subtree of + has now been evaluated
- Now + needs the value of the right subtree

# Evaluation



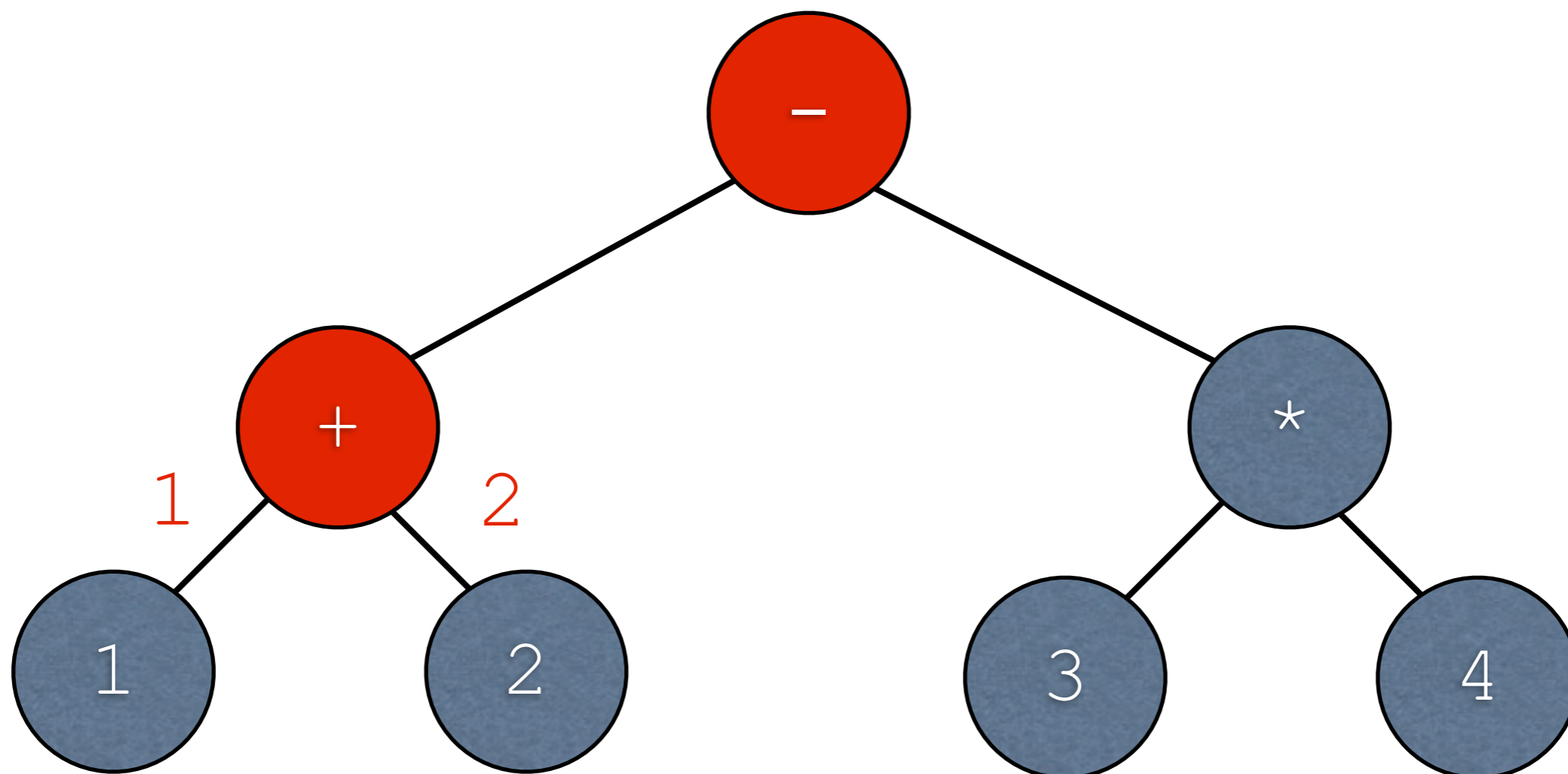
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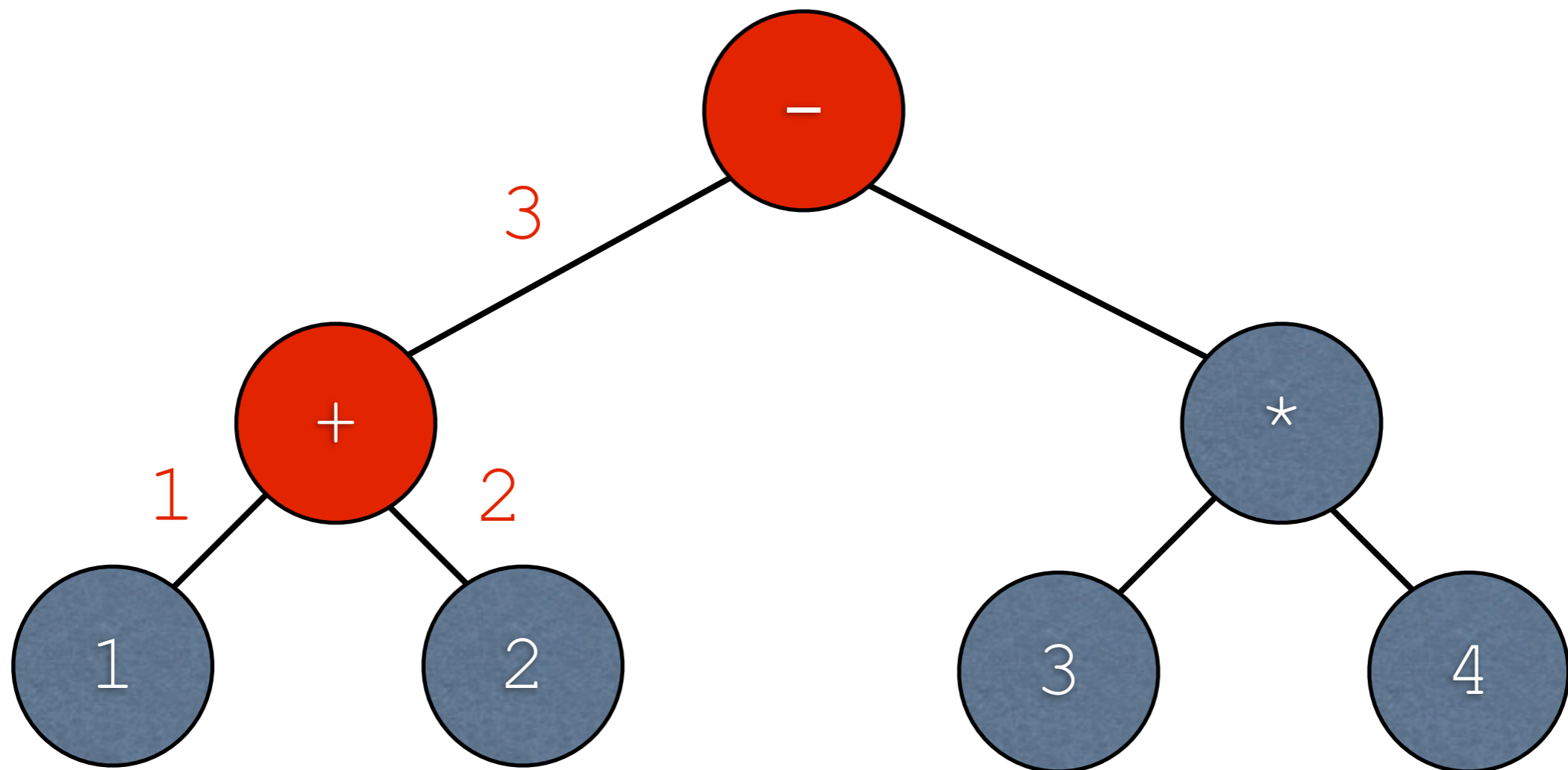
-As before, leaves just return the value held within

# Evaluation



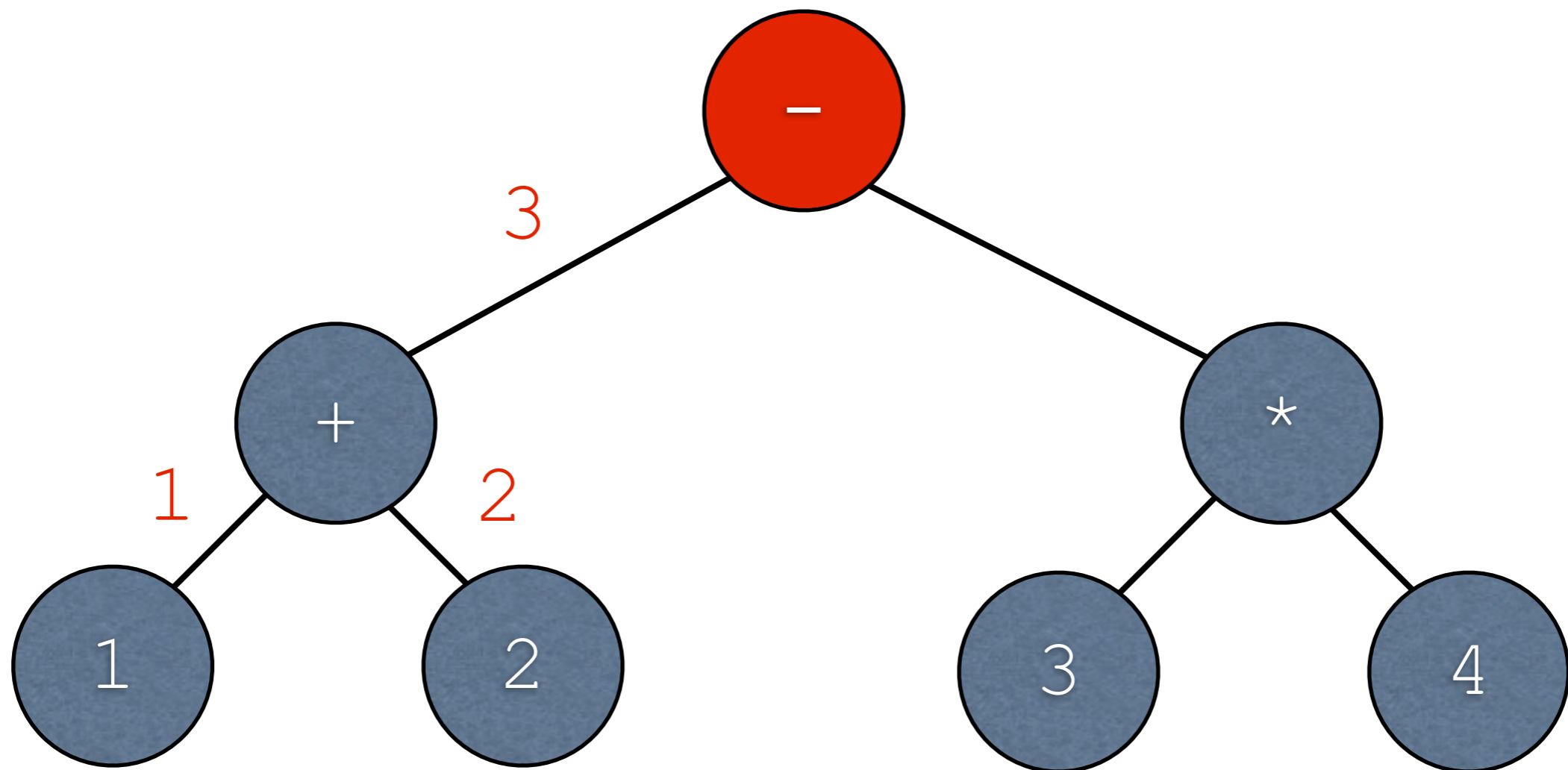
- Subtrees of + are now taken care of
- Now + has two values that it needs to work with...

# Evaluation



-+ performs the actual addition

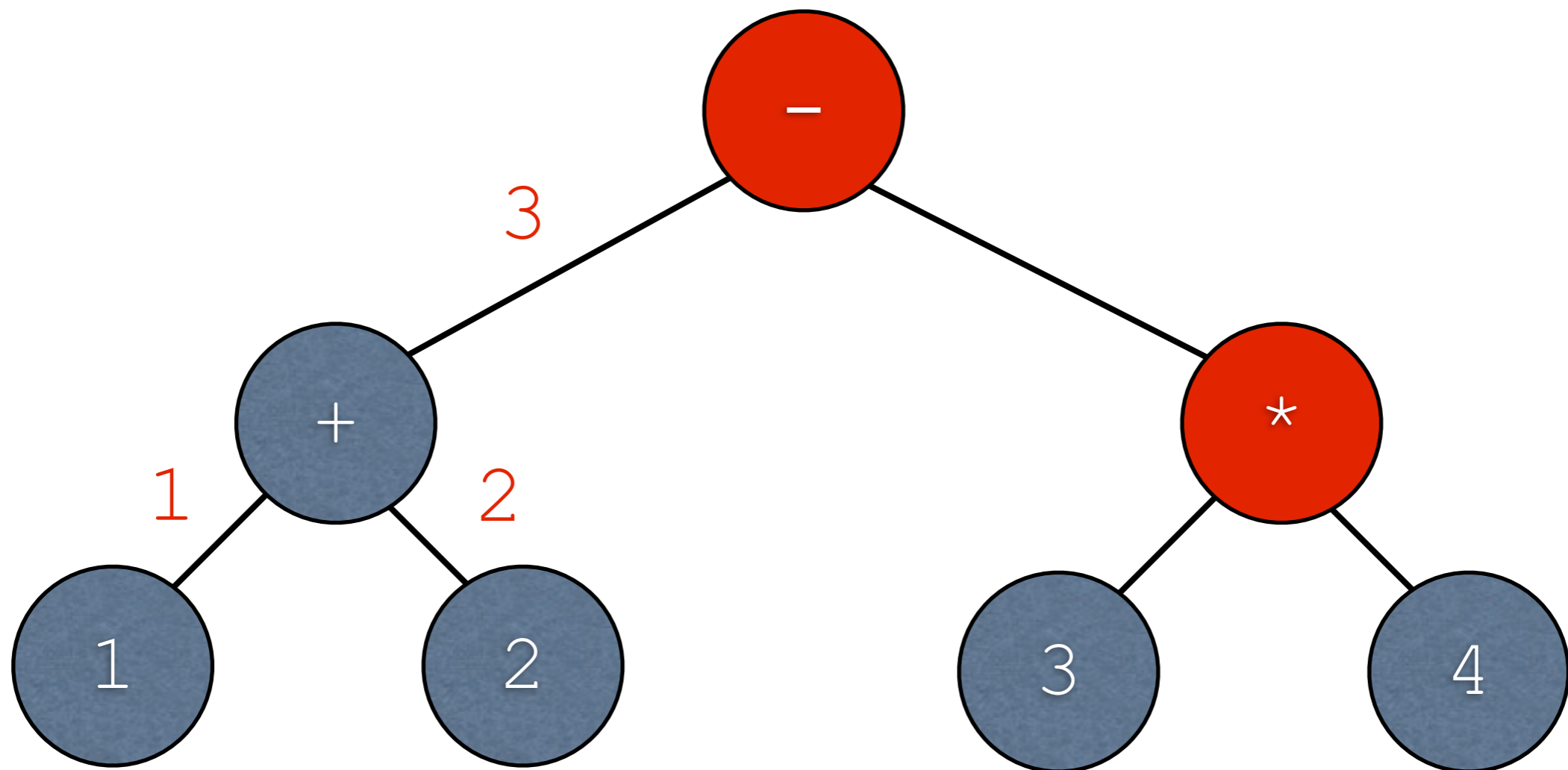
# Evaluation



-Now + is taken care of

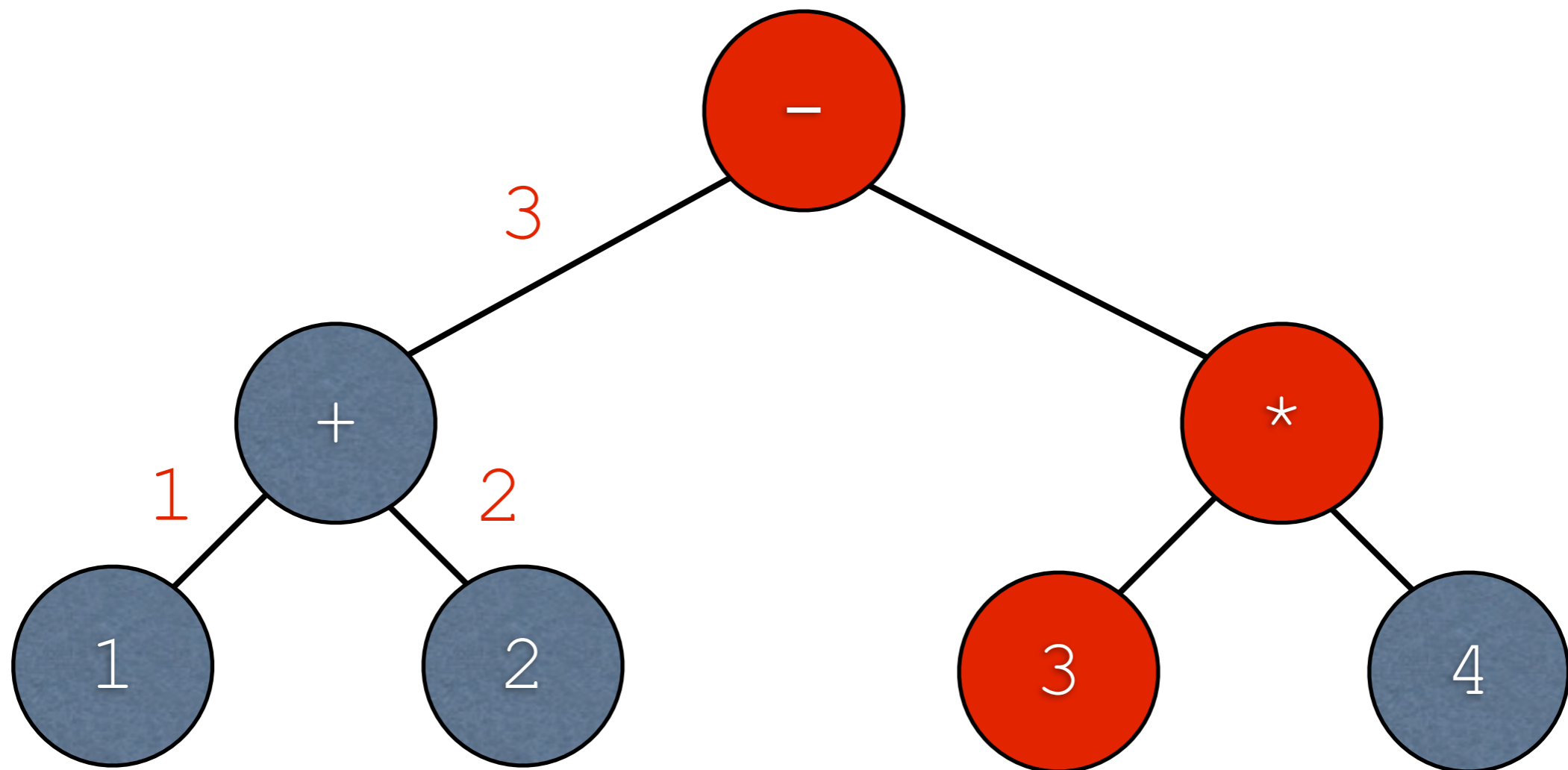
-Going back to -, - now has the value of the left subtree, and it needs the value of the right subtree

# Evaluation



-Now we're on \*, which needs the value of the left subtree...

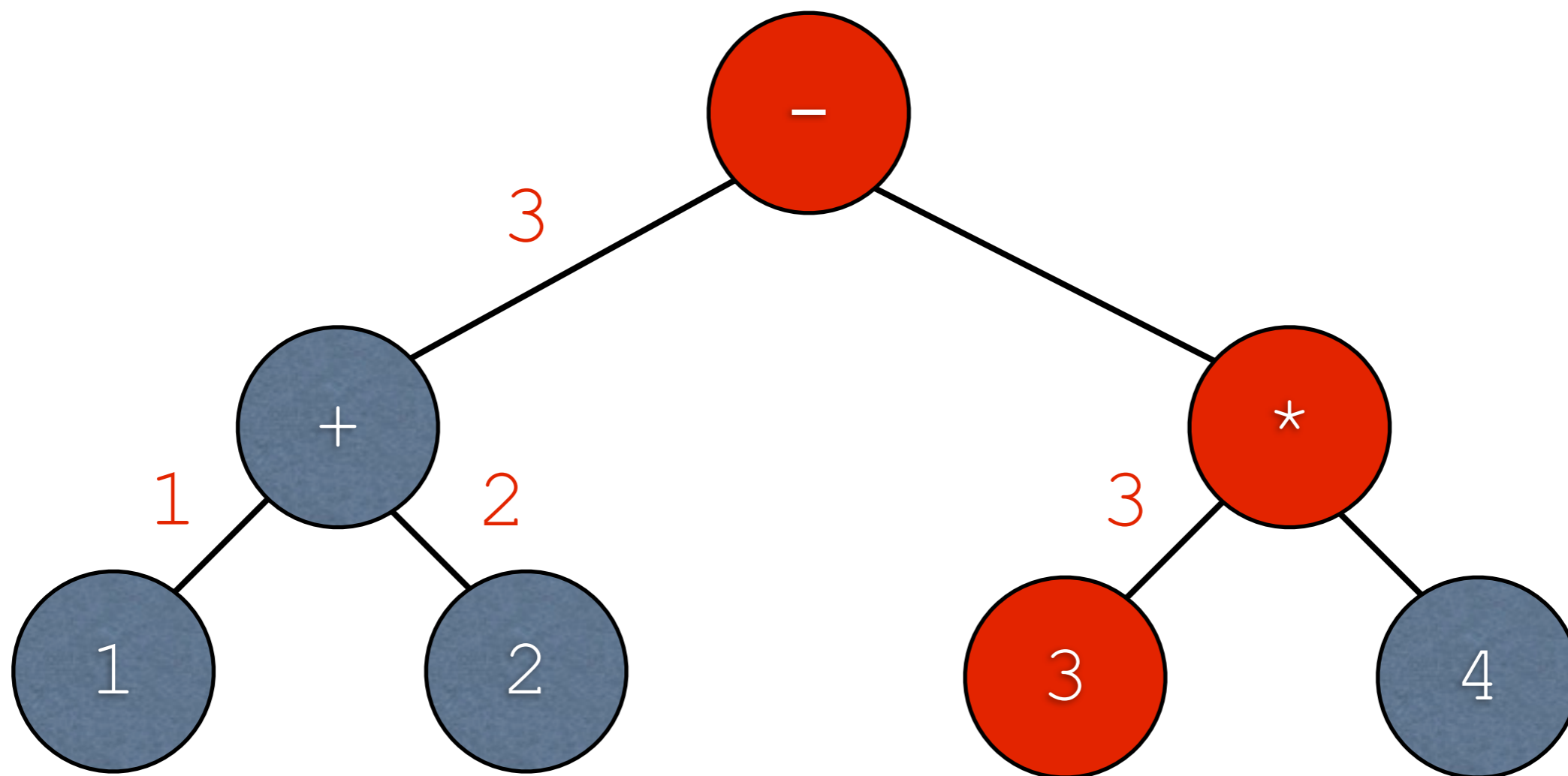
# Evaluation



-Now we're on \*, which needs the value of the left subtree...

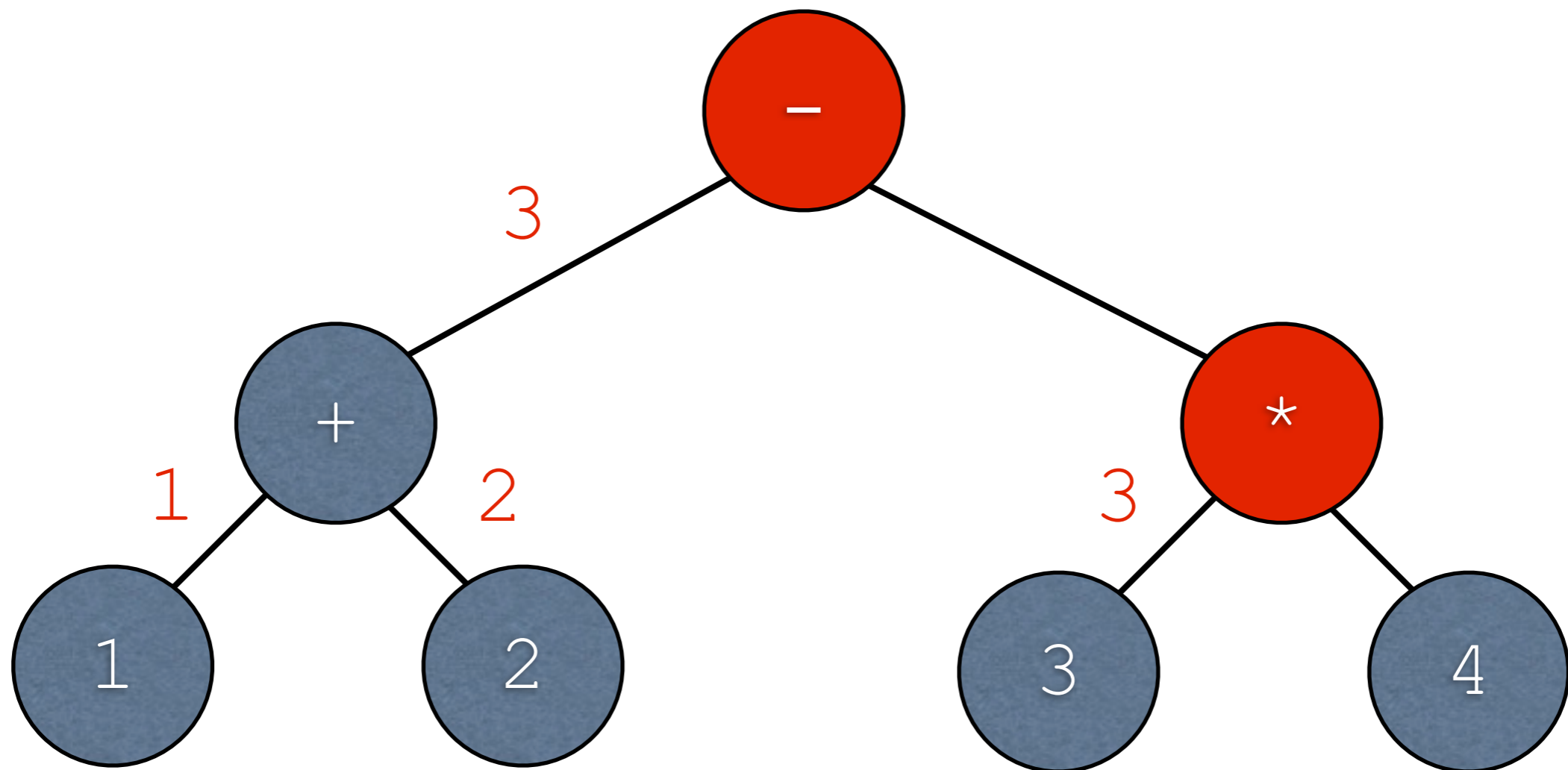


# Evaluation



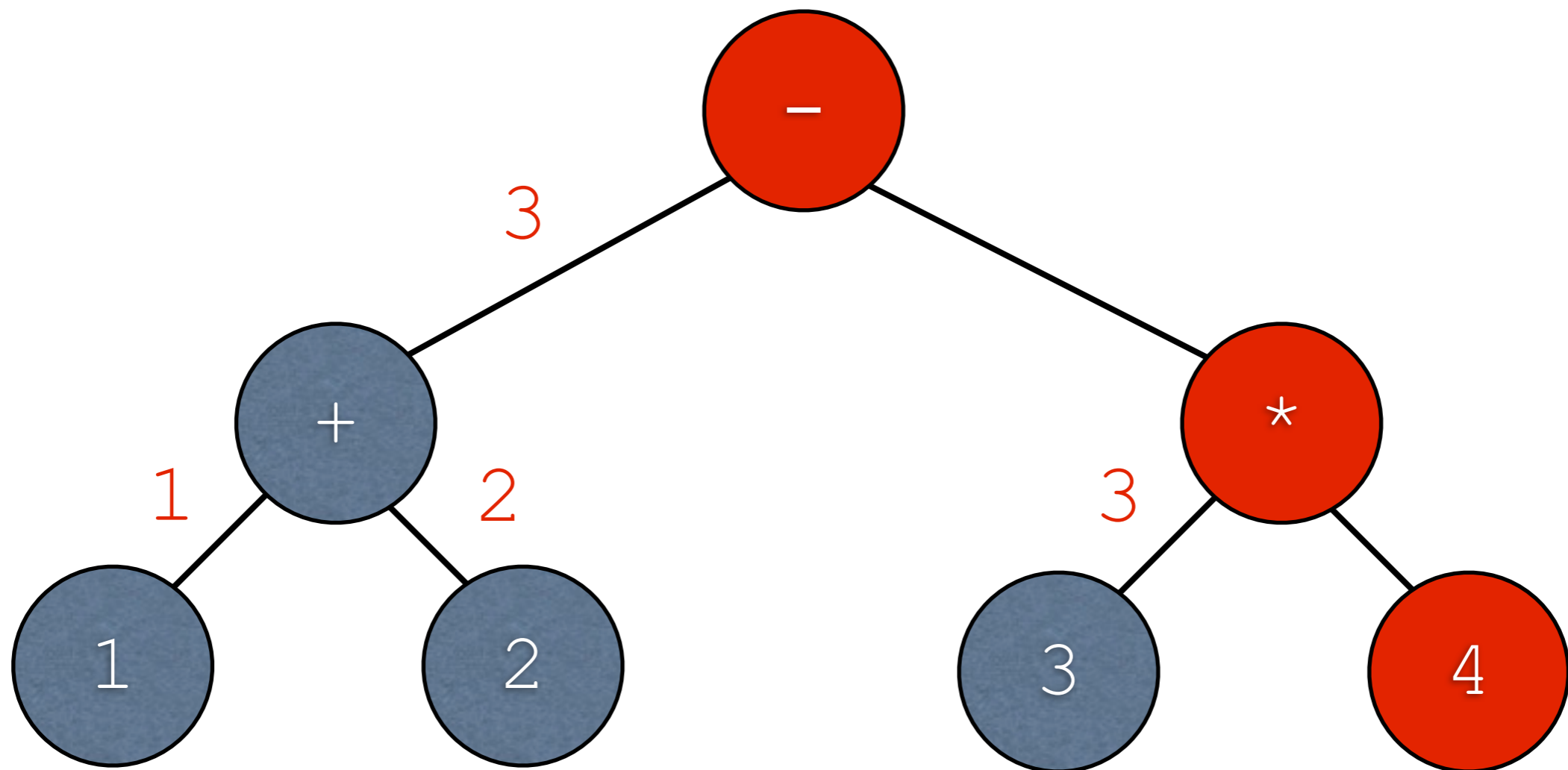
-Leaves again return the values held within...

# Evaluation



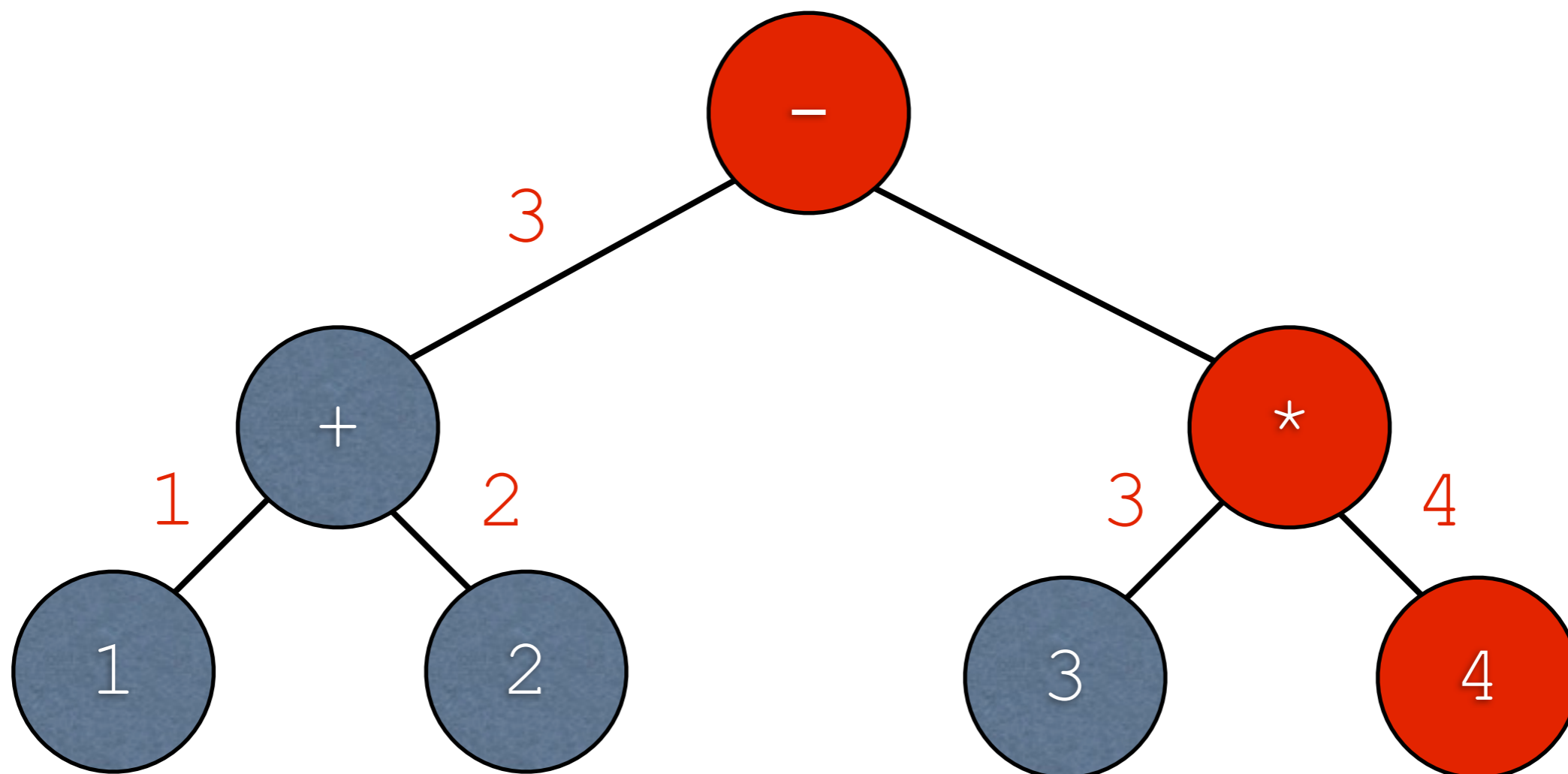
-Left subtree done; \* now needs the value of the right subtree...

# Evaluation



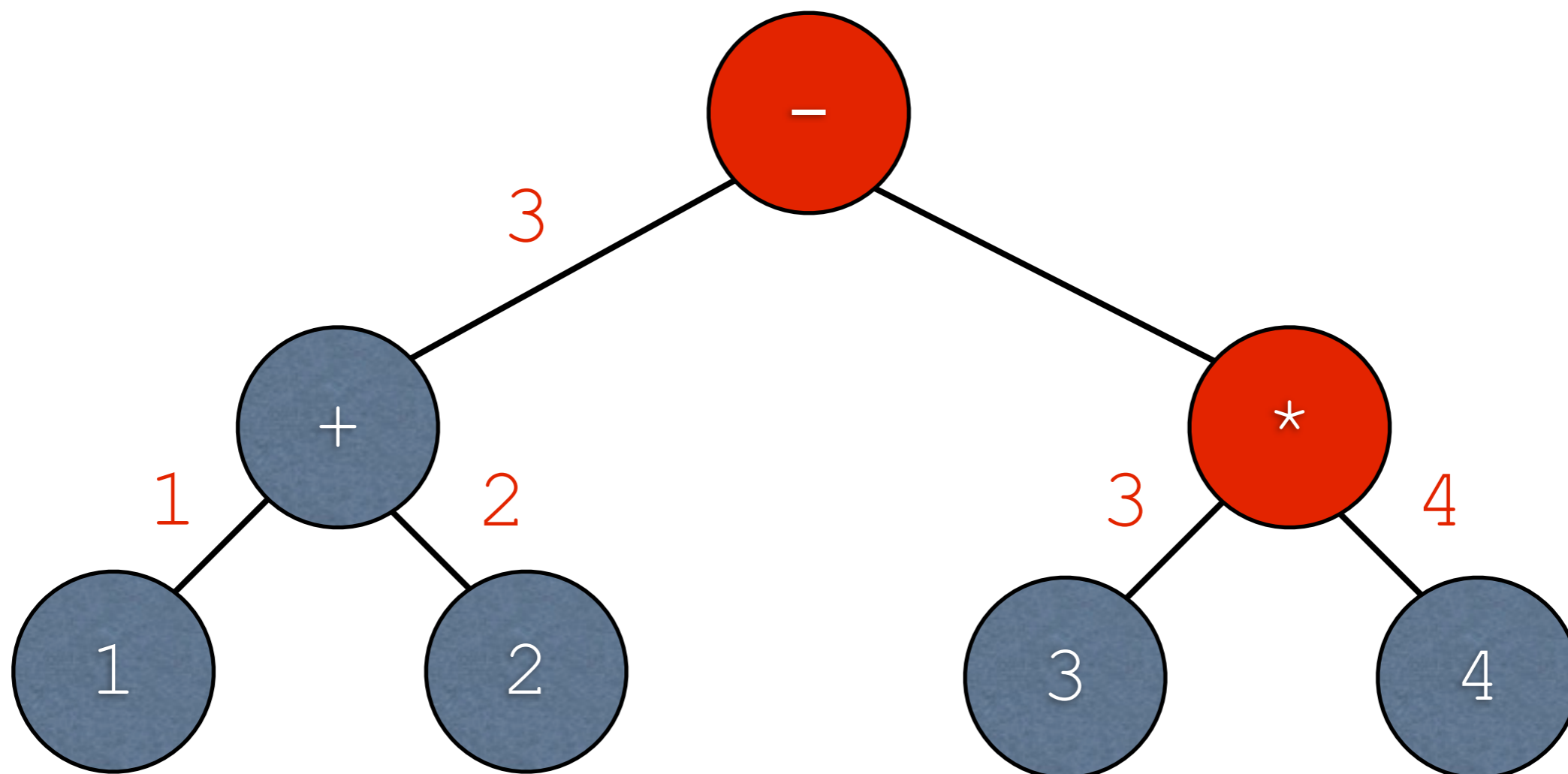
-Left subtree done; \* now needs the value of the right subtree...

# Evaluation



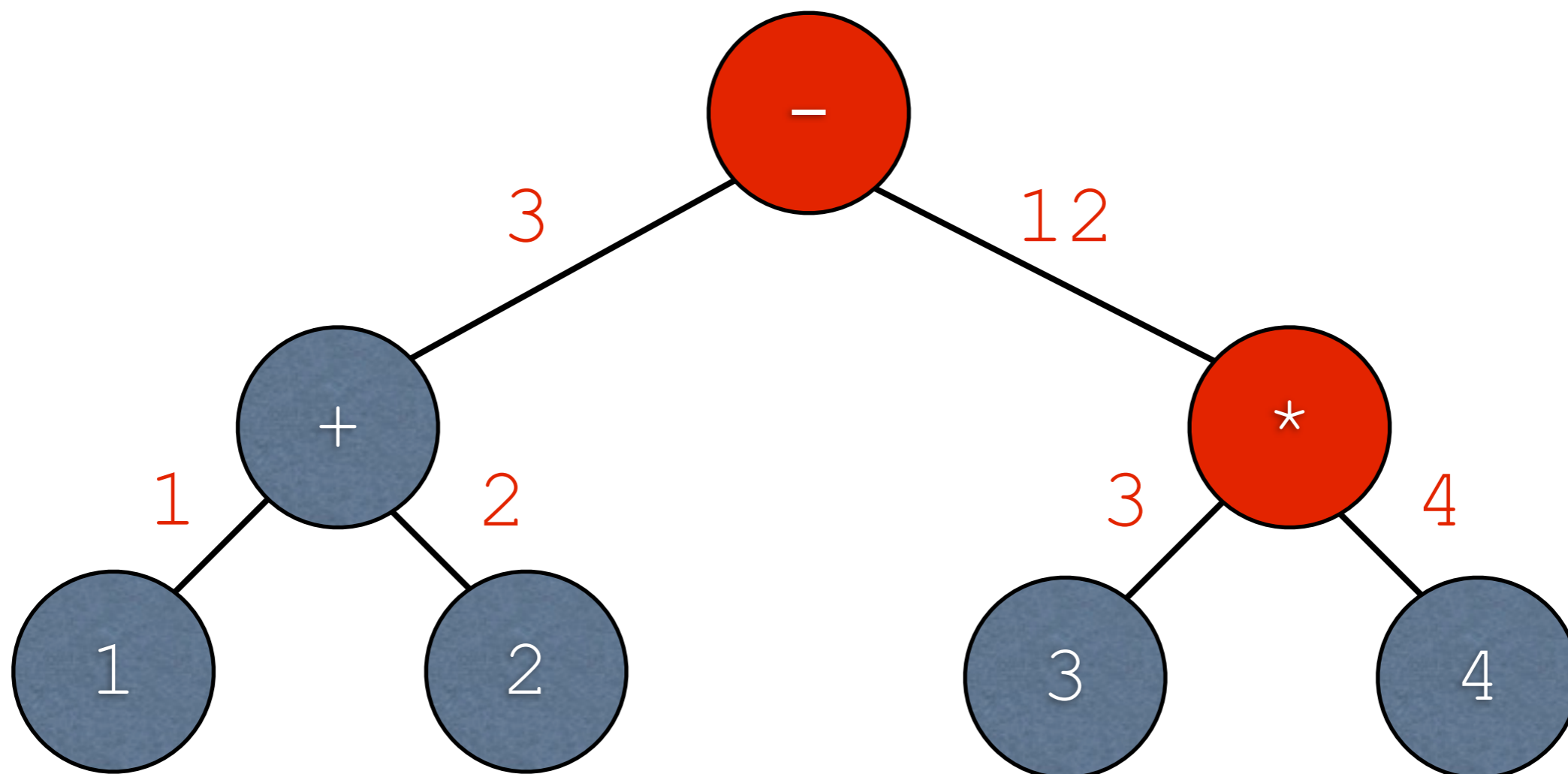
-Leaf returns value held within

# Evaluation



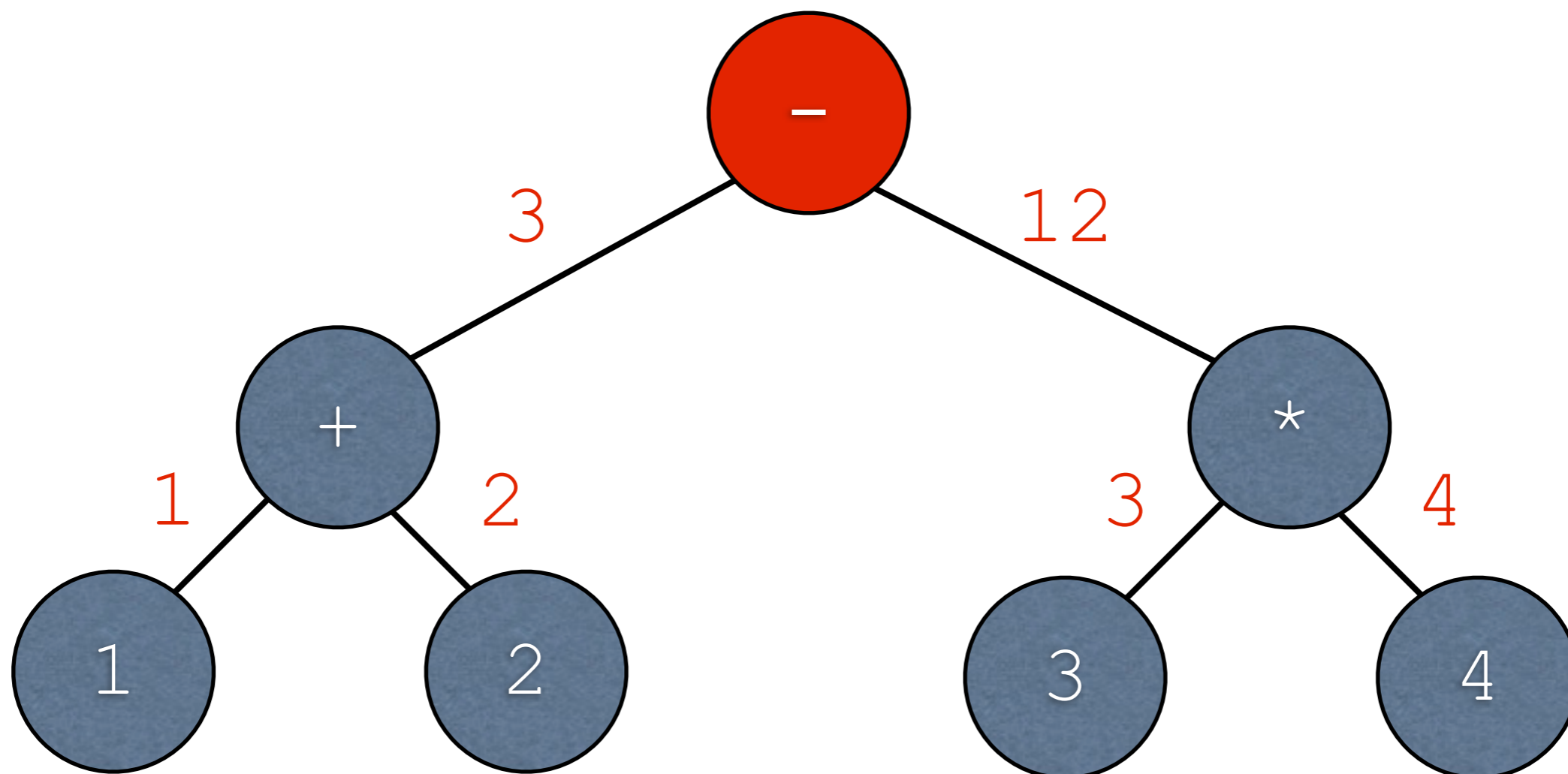
-Leaf is done. \* now has both operands it needs...

# Evaluation



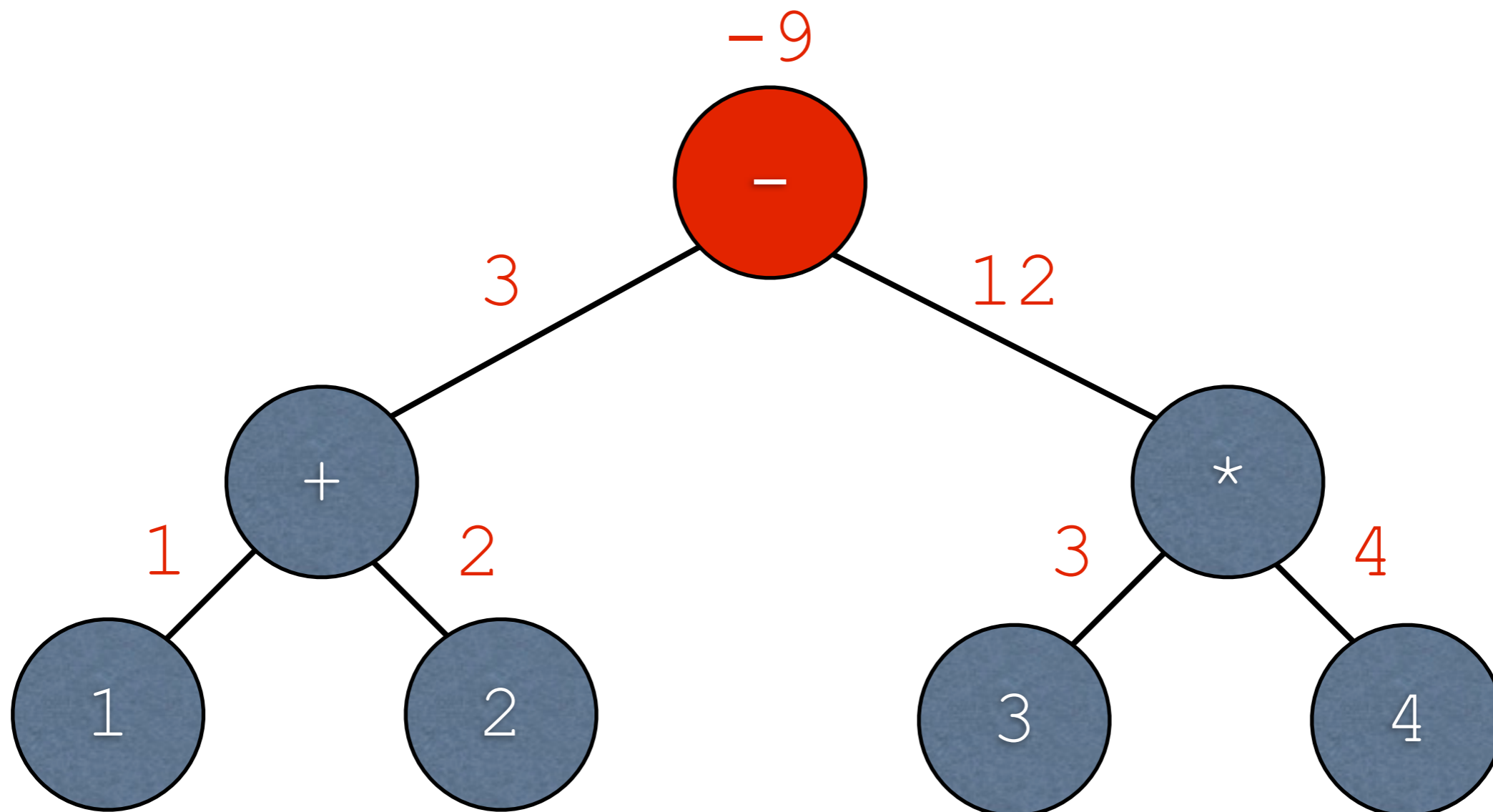
-\* performs the multiplication and returns the value

# Evaluation



-The root - node now has both operands...

# Evaluation



-...and it returns the result of the subtraction



# Evaluator Example:

`arithmetic_evaluator.rkt`

-Complete example online; we'll live-code this in class

# SAT and Semantic Tableau

# SAT Background

# SAT

- Short for the Boolean satisfiability problem
- Given a Boolean formula with variables, is there an assignment of true/false to the variables which makes the formula true?

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$$(x \vee \neg y) \wedge (\neg x \vee z)$$

# SAT

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- Given a Boolean formula with variables, is there an assignment of true/false to the variables which makes the formula true?

$$(x \vee \neg y) \wedge (\neg x \vee z)$$

**Yes:  $x$  is true,  $z$  is true**

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$$(x \vee \neg y) \wedge (\neg x \vee z)$$

Yes:  $x$  is true,  $z$  is true

$$(x \wedge \neg x)$$

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- Given a Boolean formula with variables, is there an assignment of true/false to the variables which makes the formula true?

$$(x \vee \neg y) \wedge (\neg x \vee z)$$

Yes:  $x$  is true,  $z$  is true

$$(x \wedge \neg x)$$

No



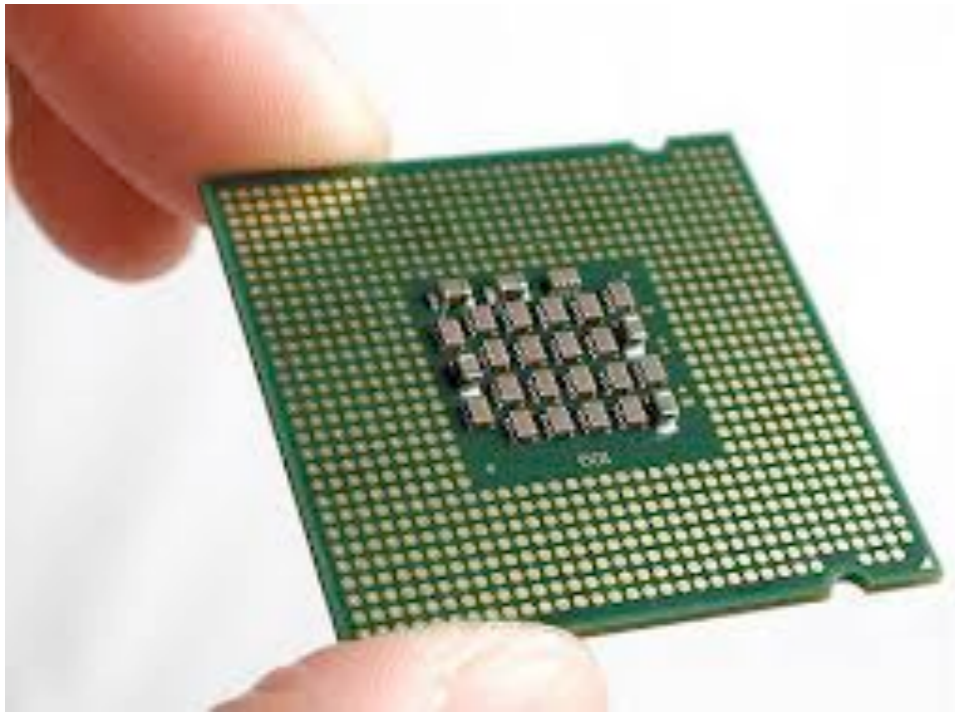
# Relevance

Widespread usage in hardware and software verification

- Verification as in proving the system does what we intend
- Much stronger guarantees than testing
- Testing can prove the existence of a bug (a failed test), whereas verification proves the absence of bugs (relative to the theorems proven)

# Relevance

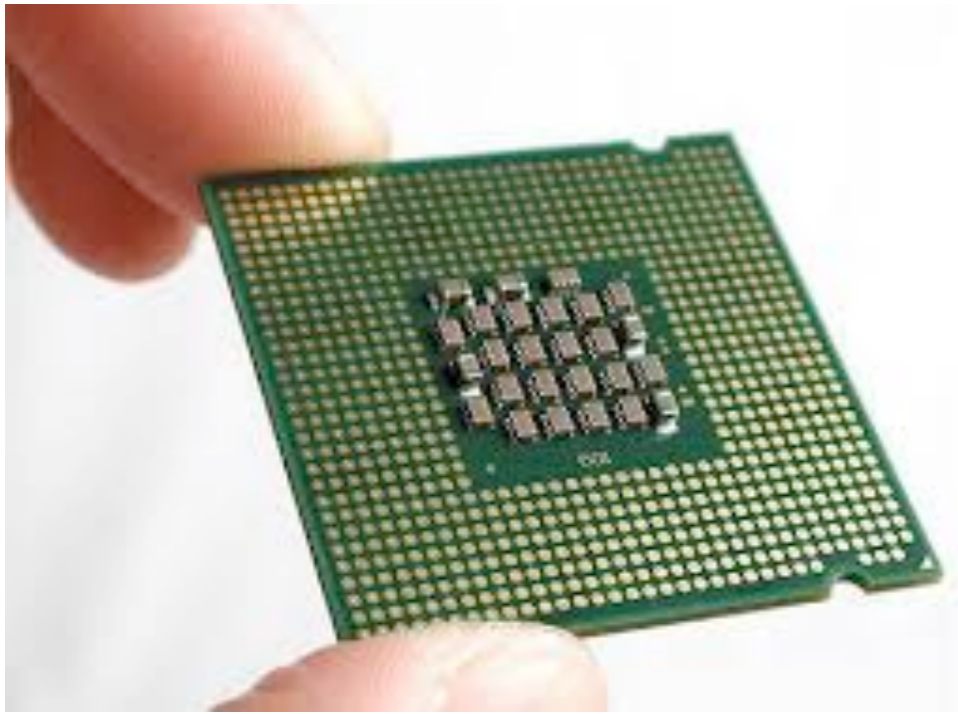
Widespread usage in hardware and software verification



- Circuits can be represented as Boolean formulas
- Can basically phrase proofs as  $\text{Circuit} \wedge \text{BadThing}$ . If unsatisfiable, then BadThing cannot occur. If satisfiable, then the solution gives the circumstance under which BadThing occurs.
- Many details omitted (entire careers are based on this stuff)

# Relevance

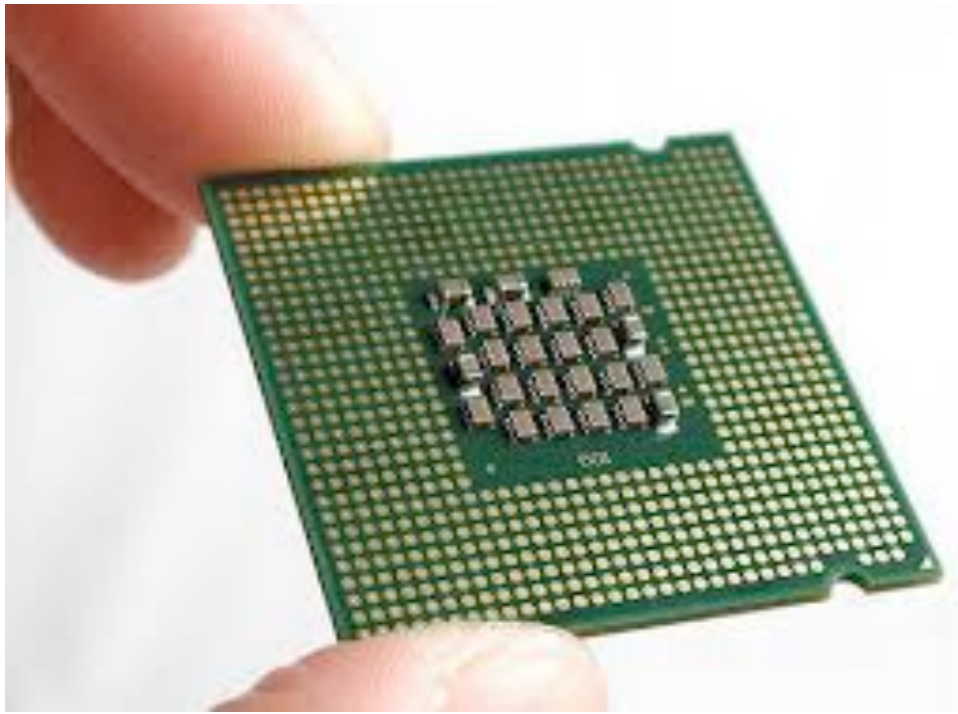
Widespread usage in hardware and software verification



- (Likely) used by AirBus to verify that flight control software does the right thing
- Lots of proprietary details so it's not 100% clear how this verification works, but SAT is still relevant to the problem

# Relevance

Widespread usage in hardware and software verification



-Nasa uses software verification for a variety of tasks; SAT is relevant, though other techniques are used, too

# Relevance to Logic Programming

- Methods for solving SAT can be used to execute logic programs
- Logic programming can be phrased as SAT with some additional stuff

# Semantic Tableau

- One method for solving SAT instances
- Basic idea: iterate over the formula
  - Maintain subformulas that must be true
  - Learn which variables must be true/false
  - Stop at conflicts (unsatisfiable), or when no subformulas remain (have solution)

-There are many methods to this

# Positive Literals

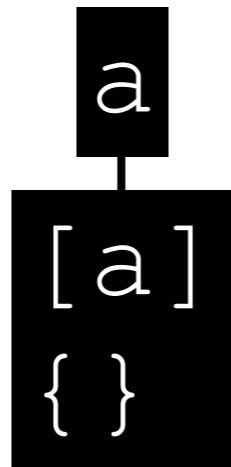
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a

-As in, the input formula is simply "a"

# Positive Literals

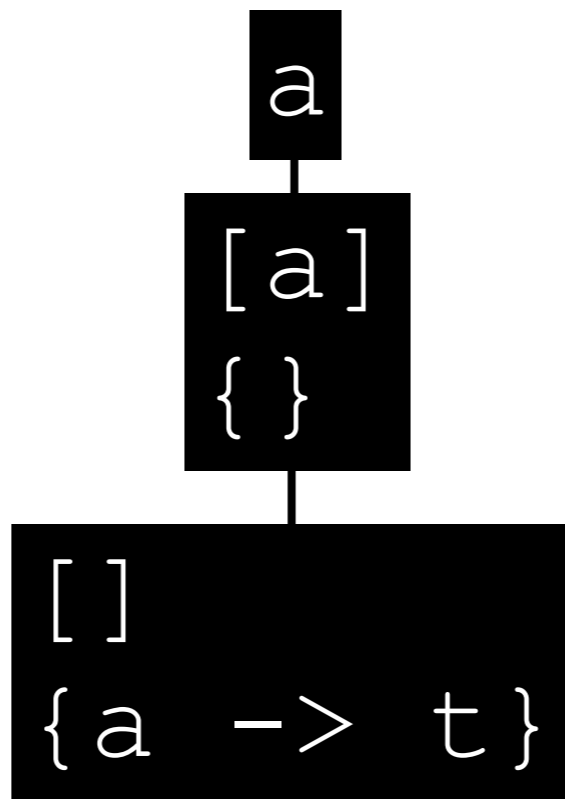
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- One subformula must be true:  $a$
- Initially, we don't know what any variables must map to

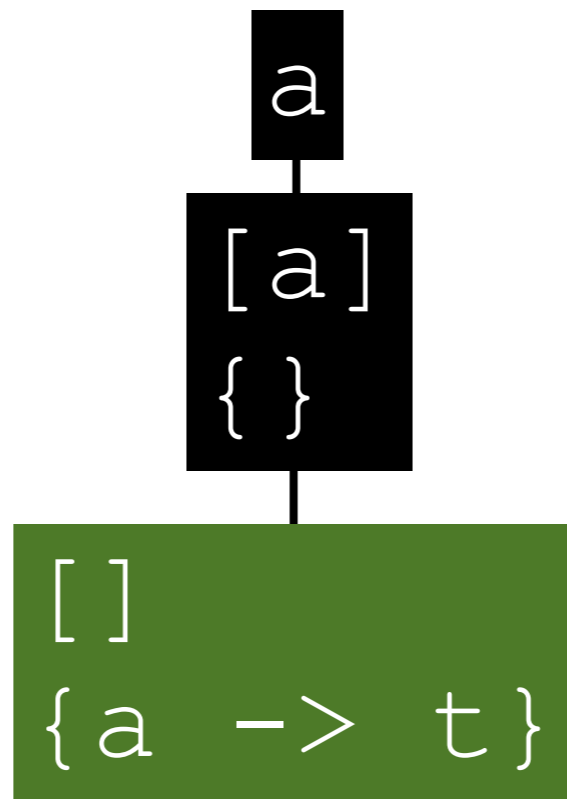


# Positive Literals



-For formula "a" to be true, it must be the case that a is true

# Positive Literals



-No subformulas remain, so we are done. The satisfying solution is that  $a$  must be true.

# Negative Literals

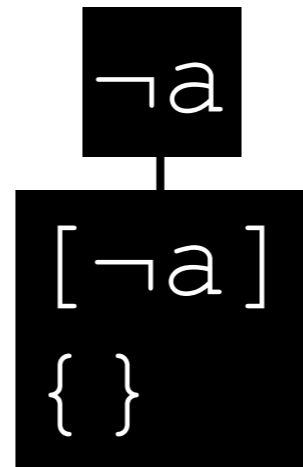
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$\neg a$

-As in, the input formula is simply " $\neg a$ "

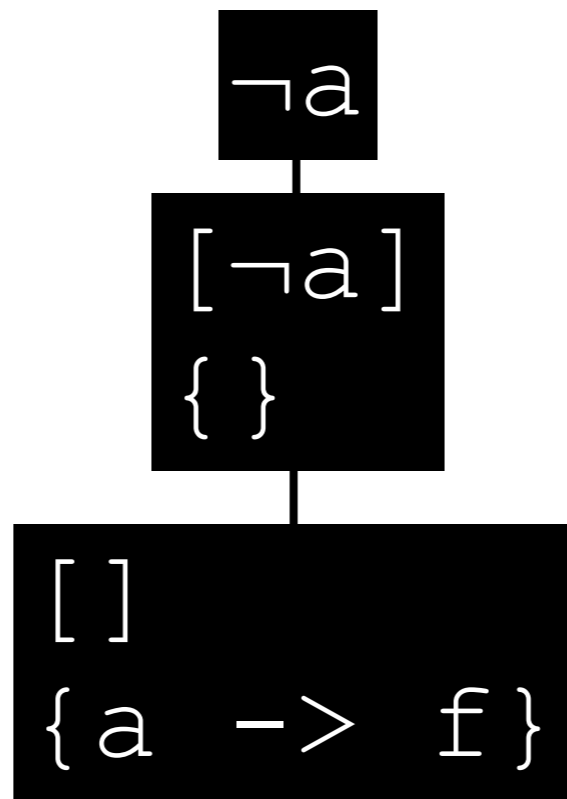
# Negative Literals

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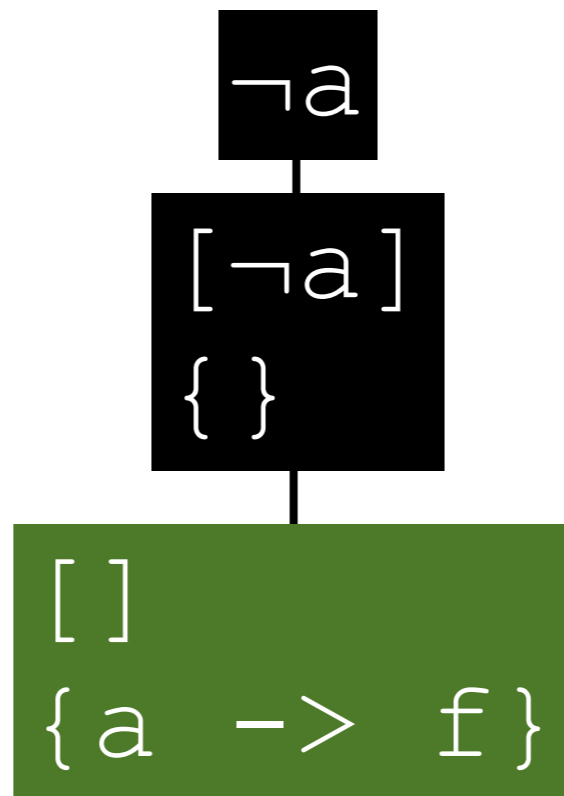
- One subformula must be true:  $\neg a$
- Initially, we don't know what any variables must map to

# Negative Literals



-For subformula " $\neg a$ " to be true, it must be the case that  $a$  is false

# Negative Literals



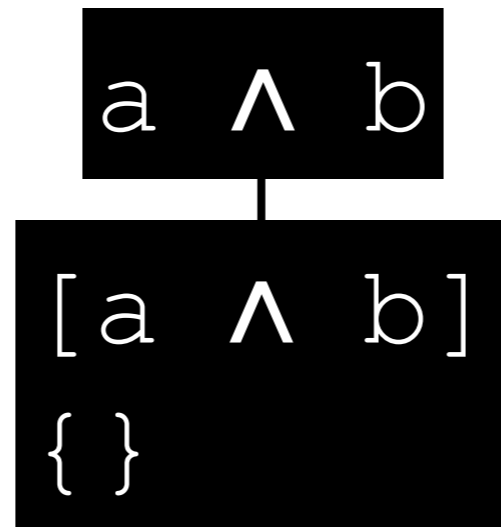
-No subformulas remain, so we are done. The satisfying solution is that “a” must be false.

# Logical And

---

$a \wedge b$

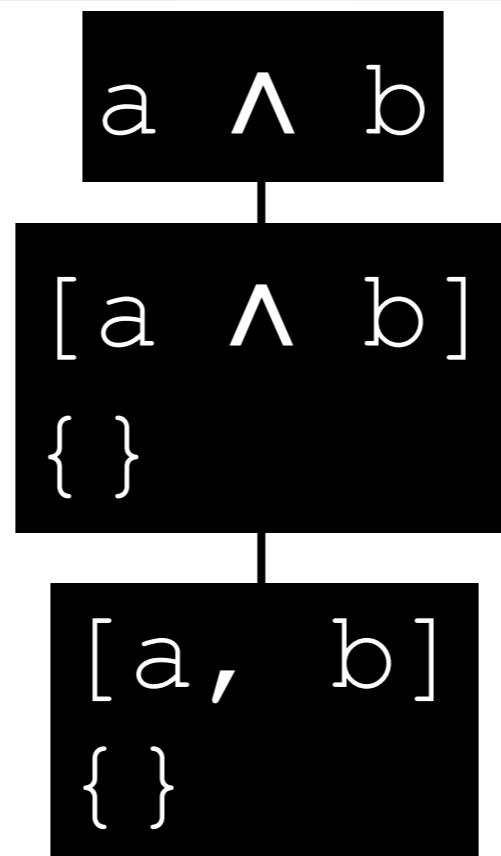
# Logical And



- Initially, one subformula must be true:  $a \wedge b$
- Initially, we don't know what any variable must map to

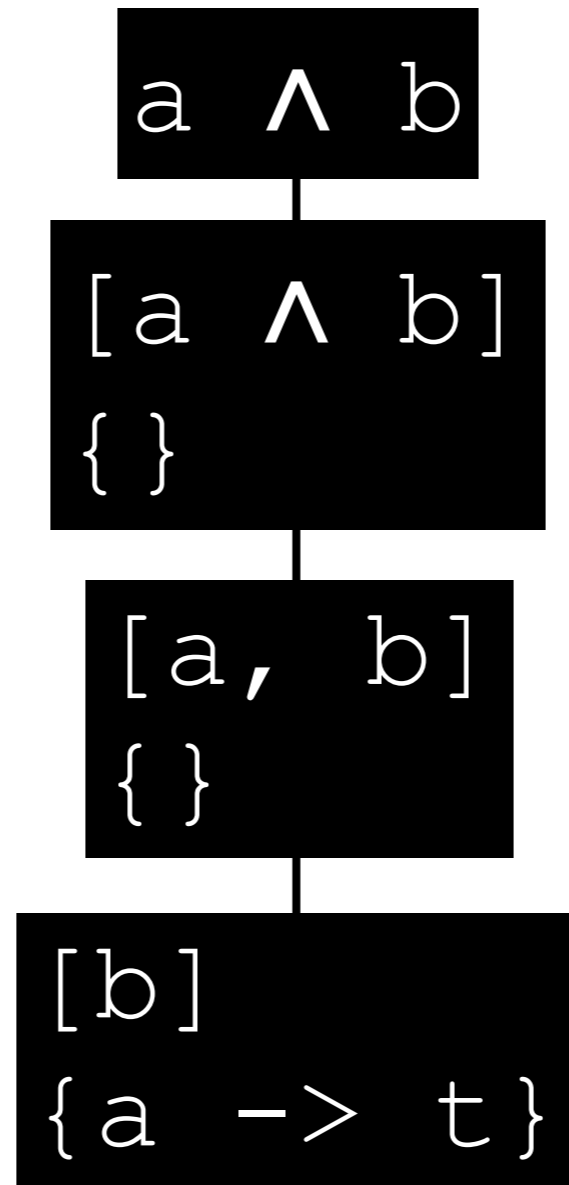


# Logical And



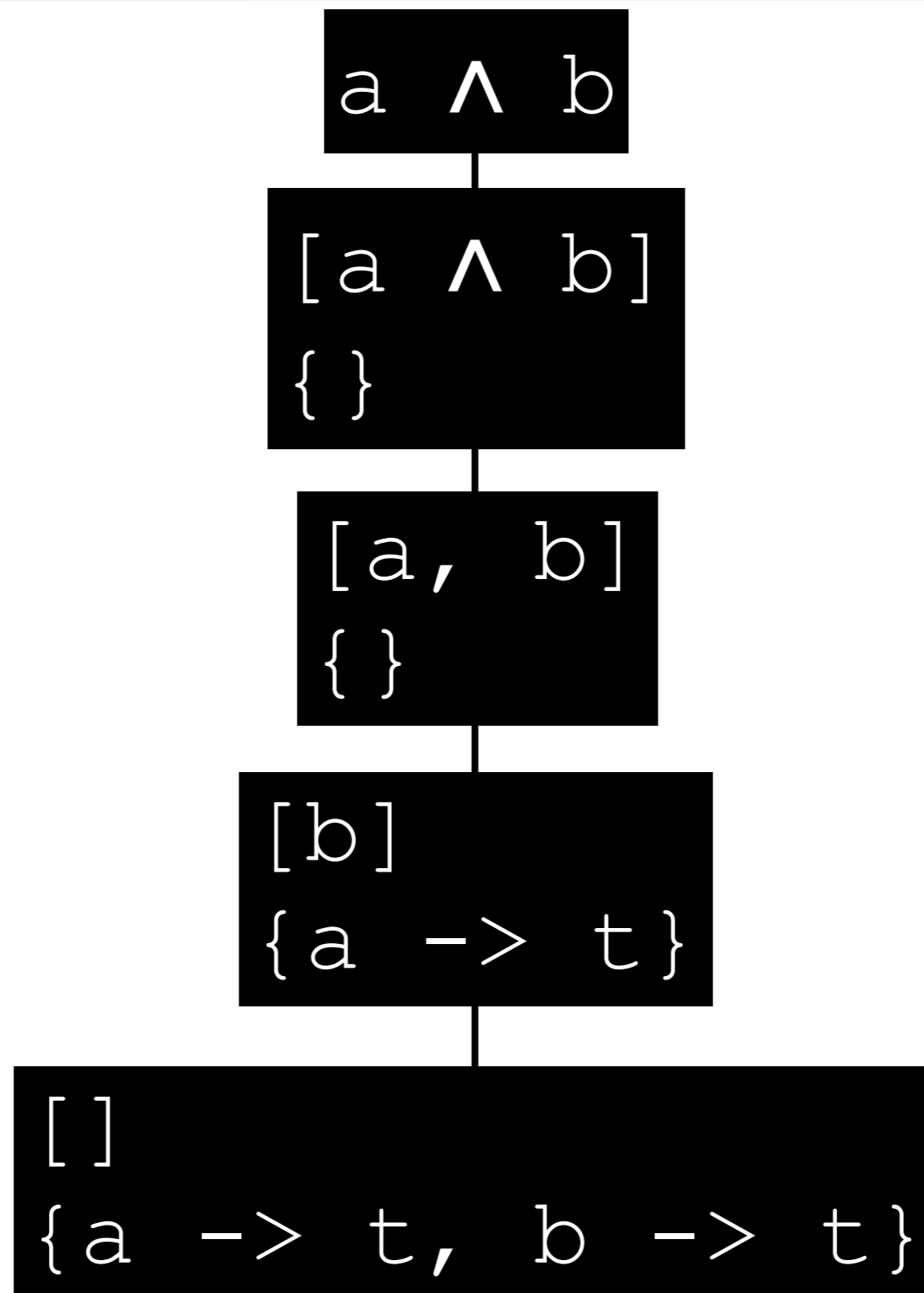
-For  $a \wedge b$  to be true, subformulas  $a$  and  $b$  must both be true

# Logical And



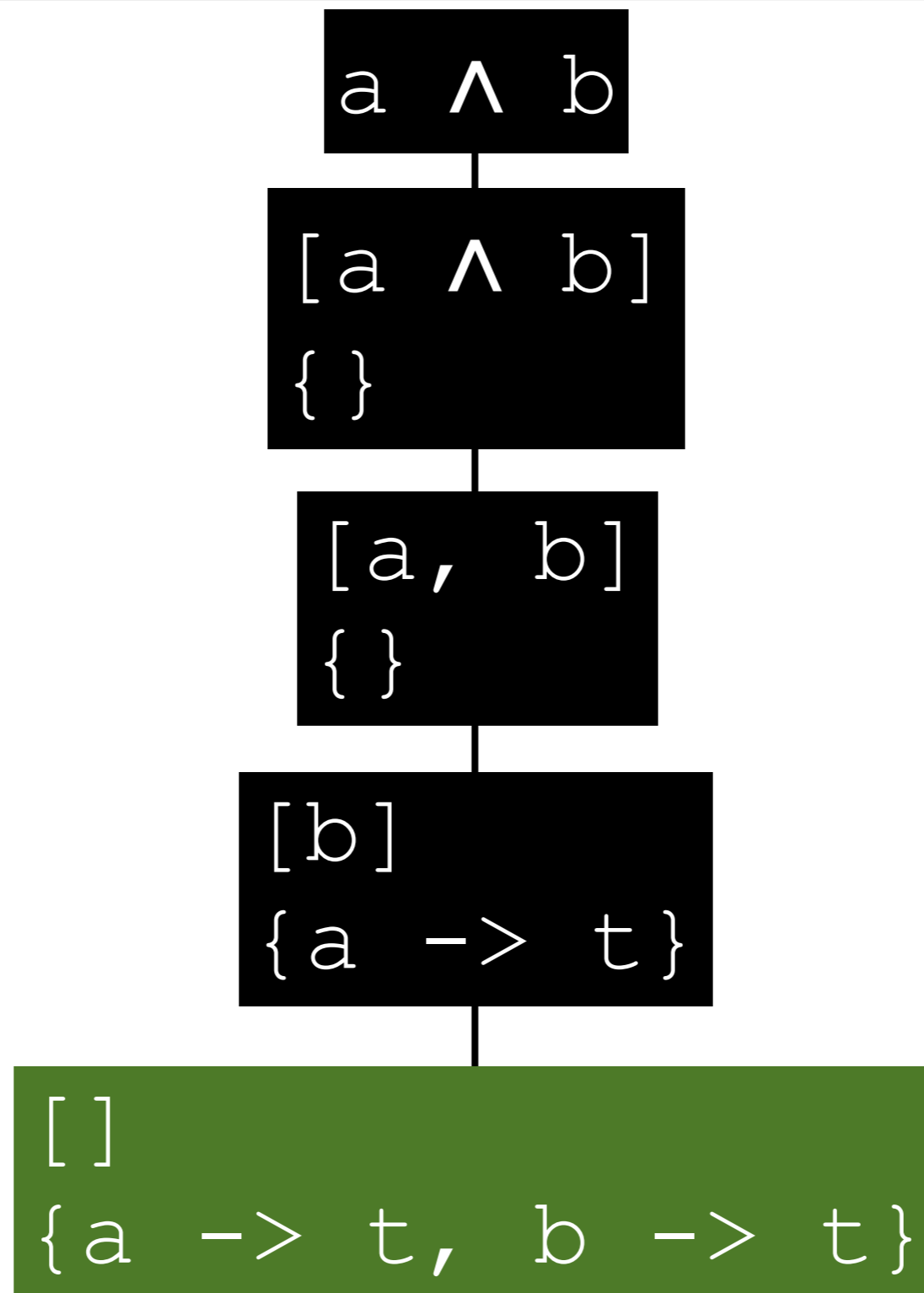
-From the positive literal case, for formula a to be true, variable a must be true

# Logical And



-From the positive literal case, for formula b to be true, variable b must be true

# Logical And



-No subformulas remain, so we are done with the solution that both a and b must be true

# Logical And

---

$$a \wedge \neg a$$

-Alternative example, showing a conflict

# Logical And

$a \wedge \neg a$

$[a \wedge \neg a]$

$\{\}$

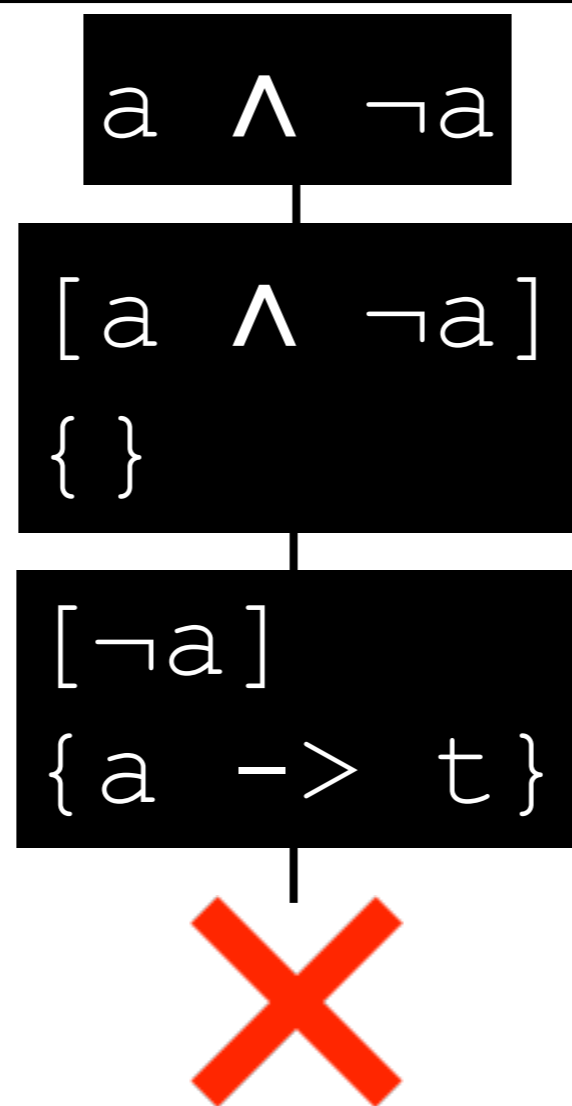
# Logical And

$a \wedge \neg a$

$[a \wedge \neg a]$   
{ }

$[\neg a]$   
{  $a \rightarrow t$  }

# Logical And



- Now we have a problem: for formula  $\neg a$  to be true, it must be the case that variable  $a$  is false
- We've already recorded that variable  $a$  must be true, which is the opposite of what we expect.
- As such, we have a conflict - this formula is unsatisfiable



# Logical Or

---

$$a \vee \neg a$$

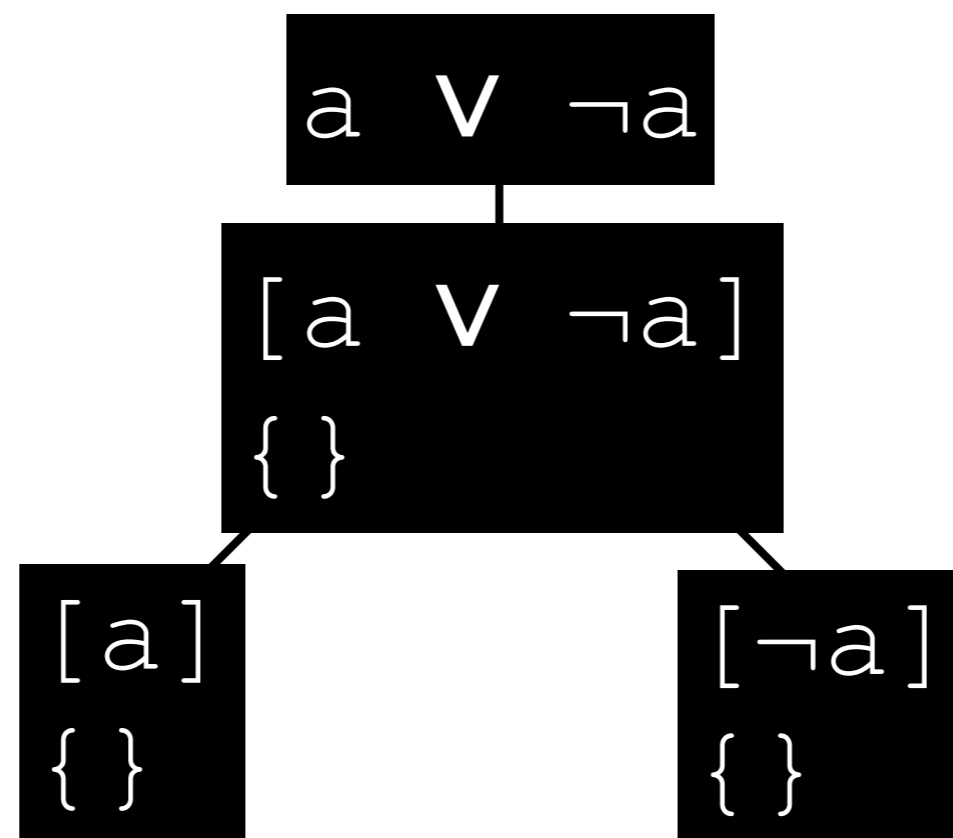
# Logical Or

$a \vee \neg a$

$[a \vee \neg a]$

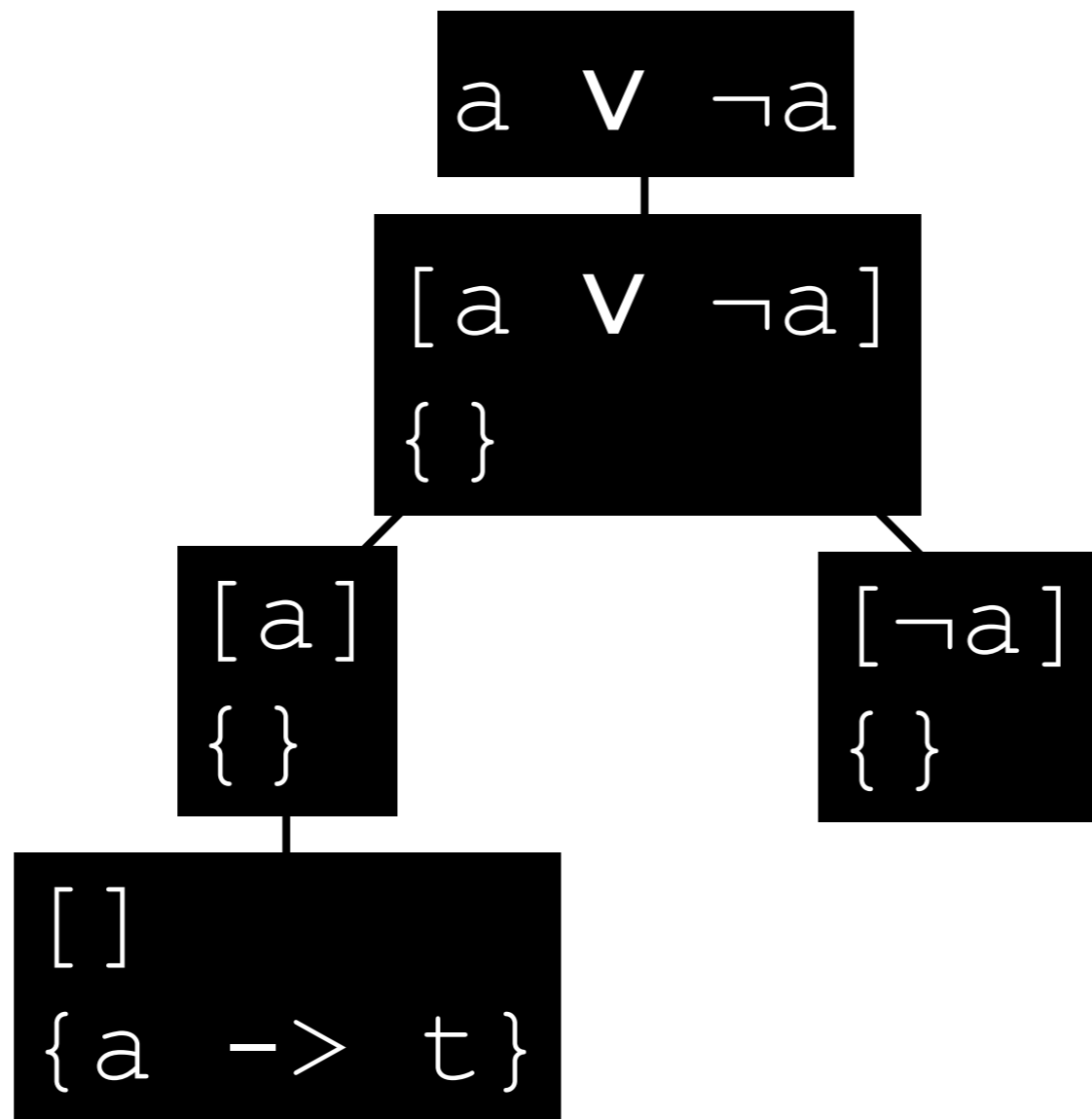
$\{\}$

# Logical Or



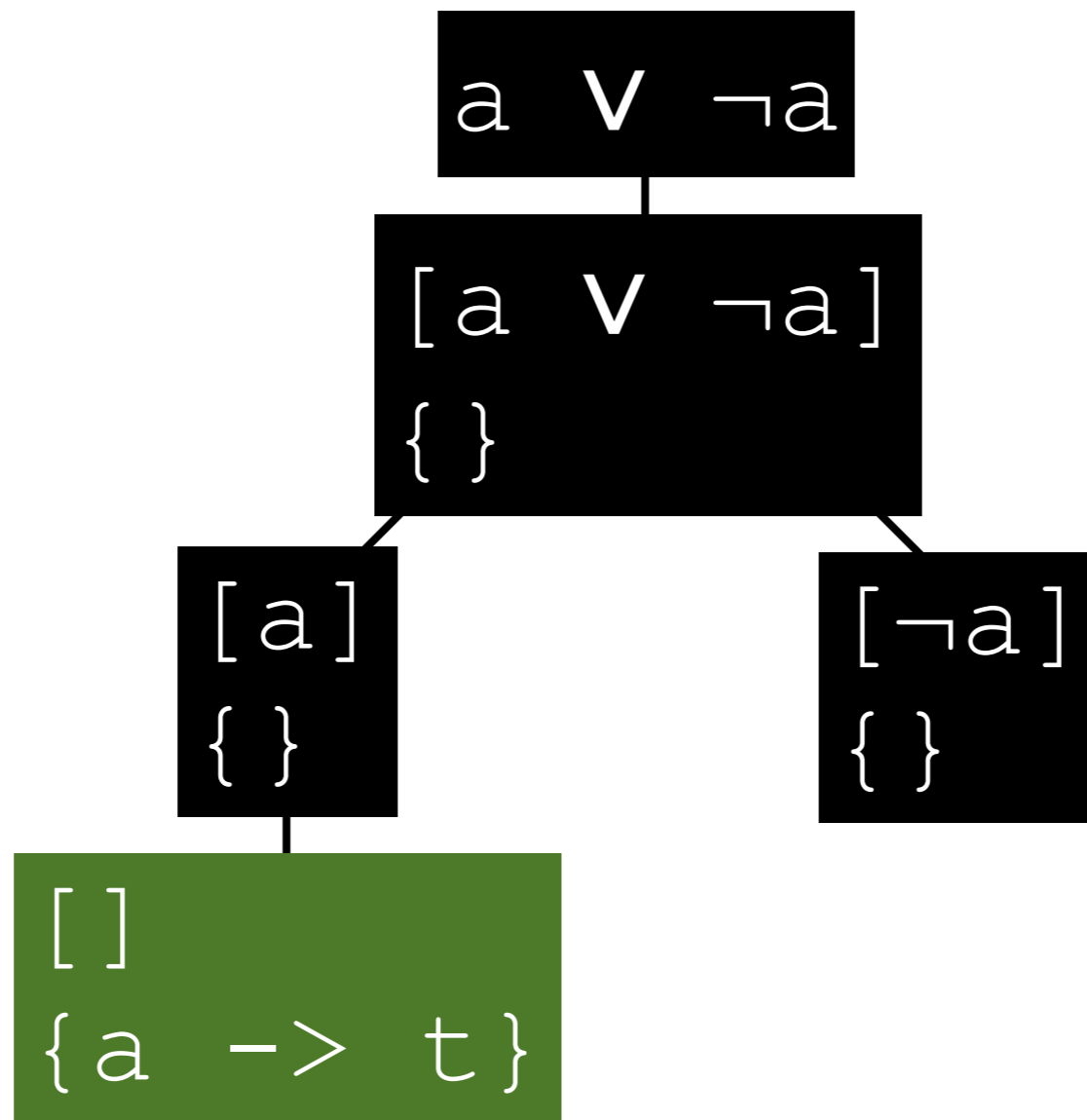
-World splits on or: in one world we pick the left subformula, and in another we pick the right

# Logical Or



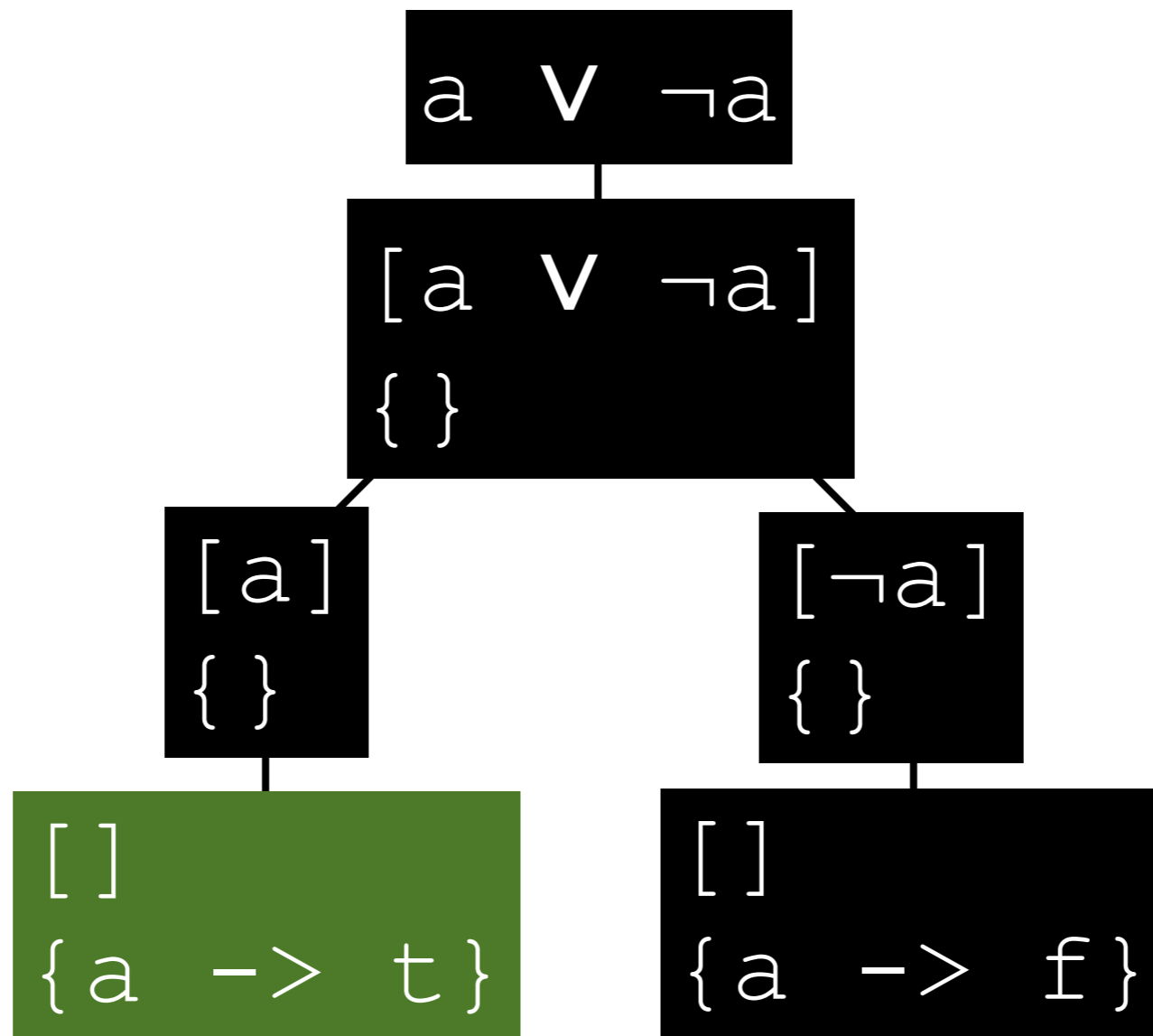
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# Logical Or



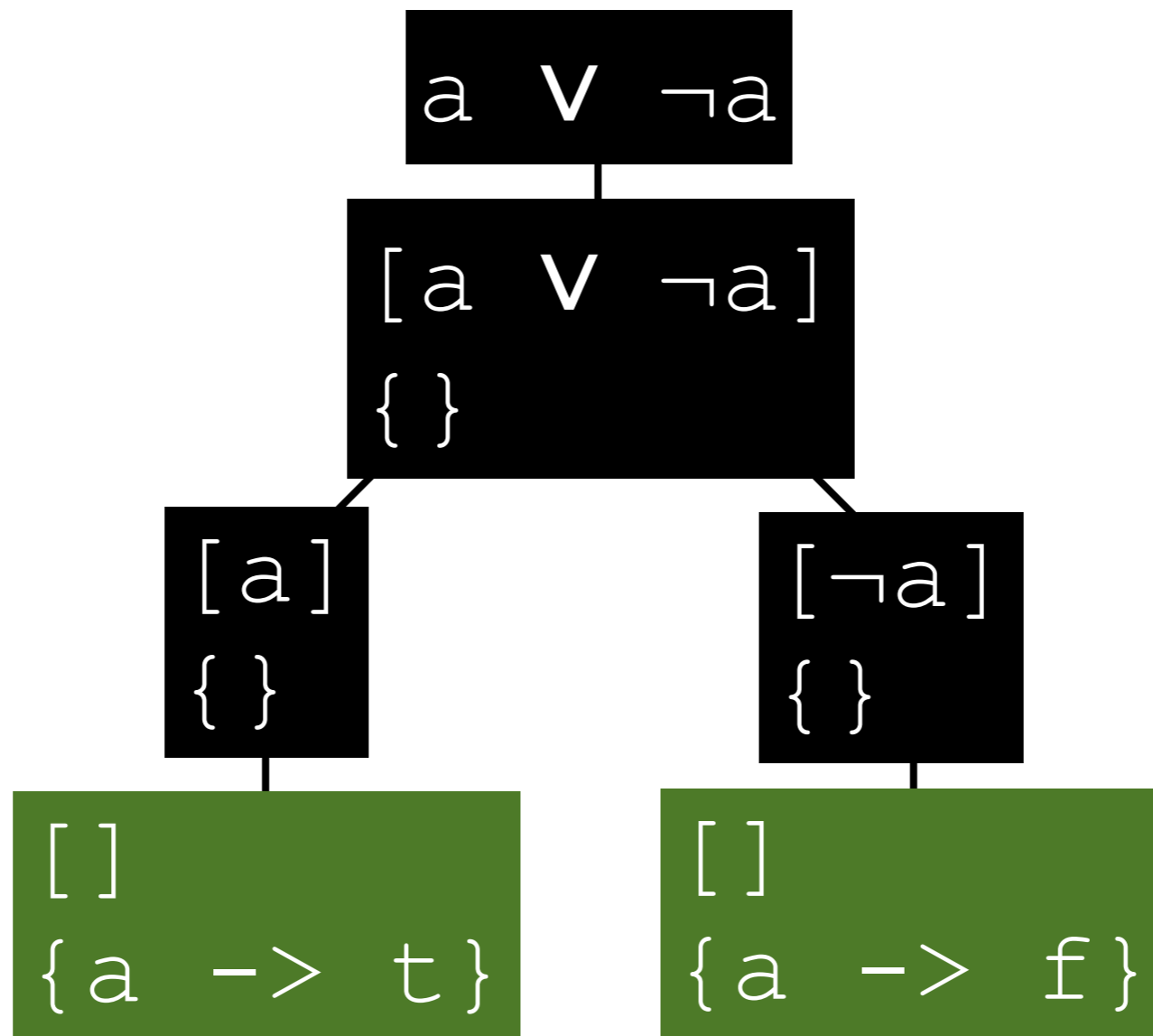
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# Logical Or



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**Examples**



**Example 1:**

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

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

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

$[(\neg b \vee a), b]$

$\{\}$

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

$[(\neg b \vee a), b]$   
 $\{\}$

$[\neg b, b]$   
 $\{\}$

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

$[(\neg b \vee a), b]$   
 $\{\}$

$[\neg b, b]$   
 $\{\}$

$[b]$   
 $\{b \rightarrow f\}$

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

$[(\neg b \vee a), b]$   
 $\{\}$

$[\neg b, b]$   
 $\{\}$

$[b]$   
 $\{b \rightarrow f\}$



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

$[(\neg b \vee a), b]$   
 $\{\}$

$[\neg b, b]$   
 $\{\}$

$[a, b]$   
 $\{\}$

$[b]$   
 $\{b \rightarrow f\}$



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

$[(\neg b \vee a), b]$   
 $\{\}$

$[\neg b, b]$   
 $\{\}$

$[a, b]$   
 $\{\}$

$[b]$   
 $\{b \rightarrow f\}$

$[b]$   
 $\{a \rightarrow t\}$





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

$[(\neg b \vee a), b]$   
 $\{\}$

$[\neg b, b]$   
 $\{\}$

$[a, b]$   
 $\{\}$

$[b]$   
 $\{b \rightarrow f\}$

$[b]$   
 $\{a \rightarrow t\}$



$[\ ]$   
 $\{a \rightarrow t,$   
 $b \rightarrow t\}$

## Example 2:

$$(x \vee \neg y) \wedge (\neg x \vee z)$$

$$(x \vee \neg y) \wedge (\neg x \vee z)$$

$$(x \vee \neg y) \wedge (\neg x \vee z)$$
$$[ (x \vee \neg y), (\neg x \vee z) ]$$
$$\{ \}$$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{x \rightarrow t\}$





$(x \vee \neg y) \wedge (\neg x \vee z)$

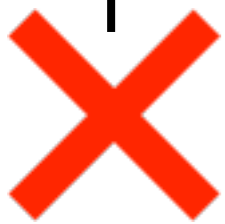
$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$



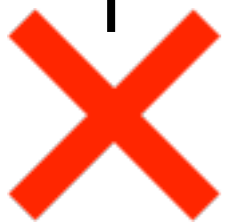
$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{x \rightarrow t\}$



$[z]$   
 $\{x \rightarrow t\}$

$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[\neg y, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$



$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

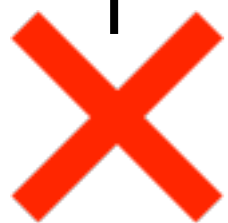
$[\neg y, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[(\neg x \vee z)]$   
 $\{y \rightarrow f\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$



$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[\neg y, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[(\neg x \vee z)]$   
 $\{y \rightarrow f\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{y \rightarrow f\}$



$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[\neg y, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

$[(\neg x \vee z)]$   
 $\{y \rightarrow f\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{y \rightarrow f\}$



$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$[\ ]$   
 $\{y \rightarrow f,$   
 $x \rightarrow f\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[\neg y, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

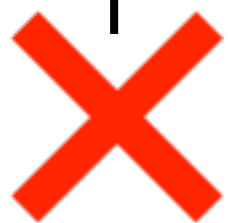
$[(\neg x \vee z)]$   
 $\{y \rightarrow f\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{y \rightarrow f\}$

$[z]$   
 $\{y \rightarrow f\}$



$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$[\ ]$   
 $\{y \rightarrow f,$   
 $x \rightarrow f\}$

$(x \vee \neg y) \wedge (\neg x \vee z)$

$[(x \vee \neg y), (\neg x \vee z)]$   
 $\{\}$

$[x, (\neg x \vee z)]$   
 $\{\}$

$[\neg y, (\neg x \vee z)]$   
 $\{\}$

$[(\neg x \vee z)]$   
 $\{x \rightarrow t\}$

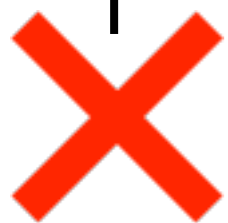
$[(\neg x \vee z)]$   
 $\{y \rightarrow f\}$

$[\neg x]$   
 $\{x \rightarrow t\}$

$[z]$   
 $\{x \rightarrow t\}$

$[\neg x]$   
 $\{y \rightarrow f\}$

$[z]$   
 $\{y \rightarrow f\}$



$[\ ]$   
 $\{x \rightarrow t,$   
 $z \rightarrow t\}$

$[\ ]$   
 $\{y \rightarrow f,$   
 $x \rightarrow f\}$

$[\ ]$   
 $\{y \rightarrow f,$   
 $z \rightarrow t\}$