



# EECS 490 – Lecture 19

## Logic Programming

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# Announcements

- ▶ HW4 due tonight at 8pm
- ▶ Project 4 due Tue 11/21 at 8pm

# Internal Linkage

- ▶ C does not have namespaces, so it uses *linkage* specifiers to avoid name conflicts between translation units
  - ▶ Also in C++, since it's mostly compatible with C
- ▶ A variable or function at global scope can be declared `static`, which specifies *internal linkage*
  - ▶ Name will not be visible outside of translation unit, avoiding name conflicts at link stage
- ▶ Variables and functions defined, not just declared, in a header should generally be `static`

```
static const double PI = 3.1415926535;  
static double area(double r) {  
    return PI * r * r;  
}
```

# External Linkage

- ▶ A global variable or function has *external linkage* if it does not have the `static` specifier
  - ▶ The name will be accessible from other translation units
- ▶ An entity with external linkage must have exactly one definition among the translation units of a program
- ▶ A function can be declared but not defined by leaving out the function body
- ▶ A variable declaration is also a definition, unless it has the `extern` specifier

```
extern int count;  
int count;
```

Just a declaration

A definition that default initializes count

# Information Hiding

- ▶ Languages often support information hiding at the granularity of a module or package
- ▶ In Java, a non-`public` class is available only to the same package
- ▶ Java and C# have module or package-level access modifiers for class members
- ▶ In C and C++, entities declared with internal linkage in a `.c` or `.cpp` file are not available to other translation units

# Opaque Types in C

- In C, struct members can be hidden by providing only a declaration and not the definition of a struct in the header file

```
typedef struct list *stack;  
stack stack_make();  
void stack_push(stack s, int i);  
int stack_top(stack s);  
void stack_pop(stack s);  
void stack_free(stack s);
```

- Other translation units can make use of the interface, but cannot access members or even directly create an object of an opaque type

```
stack s = stack_make();  
stack_push(s, 3);  
stack_pop(s);
```

# Initialization

- Languages specify semantics for initialization of the contents of a class, module, or package
- In Java, a class is initialized the first time it is used
  - Generally when an instance is created or a static member is accessed for the first time
- In Python, a module's code is executed when it is imported
  - If a module is imported again from the same module, its code does not execute again

# Circular Dependencies

- Circular dependencies between modules should be avoided
- Can require restructuring code
- Example:

```
> python3 foo.py
Traceback (most recent call last):
  File "foo.py", line 1, in <module>
    import bar
  File "bar.py", line 1, in <module>
    import foo
  File "foo.py", line 9, in <module>
    print(func1())
  File "foo.py", line 4, in func1
    return bar.func3()
AttributeError: module 'bar' has no
attribute 'func3'
```

```
import bar foo.py

def func1():
    return bar.func3()

def func2():
    return 2

print(func1())
```

```
import foo bar.py

def func3():
    return foo.func2()
```



# Initialization in C++

- C++ has a multi-step initialization process
  1. **Static initialization:** initialize compile-time constants to their values, and all other variables with static storage duration to zero
  2. **Dynamic initialization:** initialize static-storage variables using their specified initializers
    - Can be delayed until first use of the translation unit
- Within a translation unit, initialization is in program order, with some exceptions
- Order is undefined between translation units
  - Cannot rely on another translation unit being initialized first

# Logic Programming

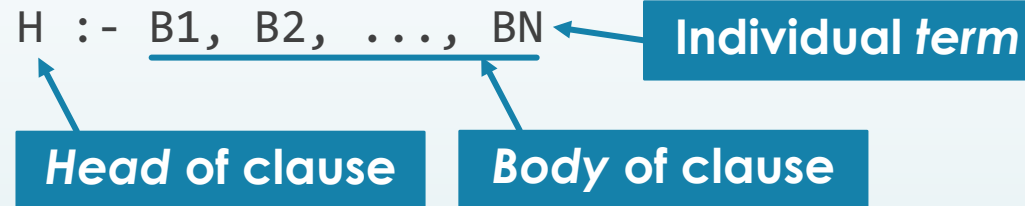
- Imperative programming: express computation as sequences of operations on the program state
- Functional programming: express computation as mappings between function inputs and outputs
- Logic programming: express computation as relations between pieces of data
- First-order predicate calculus is the foundation of logic programming

$$\forall X. \exists Y. P(X) \vee \neg Q(Y)$$

$$\forall X. \exists Y. Q(Y) \Rightarrow P(X)$$

# Horn Clauses

- ▶ A logic program is expressed as a set of *axioms* that are assumed to be true
- ▶ An axiom takes the form of a *Horn clause*, which specifies a reverse implication:



- ▶ This is equivalent to

$$(B_1 \wedge B_2 \wedge \dots \wedge B_N) \Rightarrow H$$

with implicit quantifiers.

# Queries

- A goal is a query that the system attempts to prove from the axioms

```
parent(P, C) :- mother(P, C).                % rule 1
parent(P, C) :- father(P, C).                % rule 2
sibling(A, B) :- parent(P, A), parent(P, B). % rule 3
```

```
mother(molly, bill).                        % fact 1
mother(molly, charlie).                     % fact 2
```

- Possible reasoning:

```
sibling(bill, S)
-> parent(P, bill), parent(P, S)            (rule 3)
-> mother(P, bill), parent(P, S)            (rule 1)
-> mother(molly, bill), parent(molly, S)     (fact 1)
-> mother(molly, bill), mother(molly, S)     (rule 1)
-> mother(molly, bill), mother(molly, charlie) (fact 2)
```

S = bill is also a valid solution given the axioms.

# Prolog

- ▶ Prolog is the foundational language of logic programming and is the most widely used
- ▶ A Prolog program consists of a set of Horn clauses, using the syntax on the preceding slides
- ▶ A Horn clause has a head term and optional body terms
- ▶ A term may be atomic, compound, or a variable

- ▶ Atomic: atoms and numbers

- ▶ Atom: Scheme-like symbol or quoted string

- ▶ If an atom starts with a letter, it must be lowercase

`hello =< + 'logic programming'`

- ▶ Variables: symbols that start with an uppercase letter

`Hello X`

# Compound Terms

- A compound term consists of a *functor*, which is an atom, followed by a list of one or more argument terms

`pair(1, 2) wizard(harry) writeln(hello(world))`

- A compound term is interpreted as a *predicate*, with a truth value, if it is a head term, a body term, or the goal
- Otherwise, the compound term is interpreted as data
  - e.g. `hello(world)` in `writeln(hello(world))`

# Facts and Rules

- A Horn clause with no body is a *fact*, since it is always true

```
mother(molly, bill).  
mother(molly, charlie).
```

Period signifies  
end of clause

- A Horn clause with a body is a *rule*

```
parent(P, C) :- mother(P, C).  
sibling(A, B) :- parent(P, A), parent(P, B).
```

- Meaning:

- If `mother(P, C)` is true, then so is `parent(P, C)`
- If `parent(P, A)` and `parent(P, B)` are true, then so is `sibling(A, B)`

- A program is a set of Horn clauses

# Goals and Queries

- A goal is a predicate that the interpreter attempts to prove
- Loading the program from the previous slide and entering the goal `sibling(bill, S)` produces:

```
?- sibling(bill, S).
```

```
S = bill ;
```

```
S = charlie.
```

Ask for more solutions

- A semicolon asks for more solutions
- A period ends a query
  - Can be entered by the user
  - Can be produced by the interpreter, in which case it is certain no more solutions exist



- We'll start again in five minutes.

# Implementing Lists

- Compound terms can represent data structures
- Example: use `pair(A, B)` to represent a pair

- This won't be a head or body term, so it will be treated as data

- Relations on pairs:

```
cons(A, B, pair(A, B)).  
cdr(pair(_, B), B).  
car(pair(A, _), A).  
is_null(nil).
```

Relates a first  
and second  
item to a pair

Anonymous  
variable

```
?- cons(1, nil, X).  
X = pair(1, nil).
```

```
?- car(pair(1, pair(2, nil)), X).  
X = 1.
```

```
?- cdr(pair(1, pair(2, nil)), X).  
X = pair(2, nil).
```

```
?- cdr(pair(1, pair(2, nil)), X),  
   car(X, Y), cdr(X, Z).  
X = pair(2, nil), Y = 2, Z = nil.
```

```
?- is_null(nil).  
true.
```

```
?- is_null(pair(1, nil)).  
false.
```

# Prolog Lists

- Prolog also provides built-in linked lists, specified as elements between square brackets

```
[]      [1, a]      [b, 3, foo(bar)]
```

- The pipe symbol acts like a dot in Scheme, separating some elements from the rest of the list

```
?- writeln([1, 2 | [3, 4]]).  
[1,2,3,4]  
true.
```

- This allows us to write predicates like the following:

```
contains([X|_], X).  
contains([_|Ys], X) :- contains(Ys, X).
```

# Numbers and Comparisons

- Prolog includes integer and floating-point numbers
- Comparison predicates can be written in infix order

```
?- 3 =< 4.      % less than or equal  
true.
```

```
?- 4 =< 3.  
false.
```

```
?- 3 == 3.      % arithmetic equal  
true.
```

```
?- 3 =\= 3.     % arithmetic not equal  
false.
```

- The = operator specifies explicit unification, not equality

# Arithmetic

- Arithmetic operators represent compound terms and are not evaluated

```
?- 7 = 3 + 4.  
false.
```

7 does not unify with  $+(3, 4)$

- Comparisons perform evaluation on both operands

```
?- 7 == 3 + 4.  
true.
```

7 is equal to the result of evaluating  $+(3, 4)$

- The `is` operator unifies its first argument with the arithmetic result of its second argument

```
?- 7 is 3 + 4.  
true.
```

```
?- X is 3 + 4.  
X = 7.
```

# List Length

- We can now define a predicate for length on our list representation:

```
len(nil, 0).  
len(pair(_, B), L) :- len(B, M), L is M + 1.
```

Unify L with the  
result of  $+(M, 1)$

```
?- len(nil, X).  
X = 0.
```

```
?- len(pair(1, pair(b, nil)), X).  
X = 2.
```

Must be second  
body term so that  
M is sufficiently  
instantiated for  
arithmetic

- Built-in lists have a built-in length predicate

```
?- length([1, a, 3], X).  
X = 3.
```

# Side Effects

- Prolog provides I/O predicates, including reading from standard input and writing to standard output
- We will only use `write` and `writeln`:

```
?- X = 3, write('The value of X is: '),  
    writeln(X).  
The value of X is: 3  
X = 3.
```

# Unification and Search

- A logic solver is built around the processes of *unification* and *search*
- Search in Prolog uses *backward chaining*
  - Start with a set of goal terms
  - Look for a clause whose head can unify with a goal term
  - If unification succeeds, replace the old goal term with the body terms of the clause
  - Search succeeds when no more goal terms remain
- Unification attempts to unify two terms, which may require recursively unifying subterms
  - May require *instantiating* variables to values



# Unification

- ▶ An atomic term only unifies with itself
- ▶ A variable unifies with any term
  - ▶ If the other term is not a variable, then the variable is *instantiated* with the value of the other term, i.e. all occurrences of the variable are replaced with the value
  - ▶ If the other term is a variable, the two variables are bound together such that later instantiating one with a value also instantiates the other with the same value
- ▶ A compound term unifies with another compound term if the functors and number of arguments are the same, and the arguments recursively unify

$X = 3$

$Y = \text{foo}(1, Z)$

$\text{foo}(1, A) = \text{foo}(B, 3) \quad \% \text{ unifies } B = 1, A = 3$

# Instantiation and Renaming

- ▶ Applying a clause involves renaming variables that occur in different contexts to be unique and can result in instantiation of variables
  - ▶ Analogous to  $\alpha$ - and  $\beta$ -reduction in  $\lambda$ -calculus

- ▶ Example:

`foo(X, Y) :- bar(Y, X).`

`?- foo(3, X).`

1. Rename rule to `foo(X1, Y1) :- bar(Y1, X1).`
2. Unify `foo(3, X)` with `foo(X1, Y1)`, resulting in `X1 = 3` and `X <=> Y1`
3. New goal term `bar(X, 3)`

# Search Order

- In pure logic programming, search order is irrelevant as long as the search terminates
- In Prolog, clauses are applied in program order, and terms within a body are resolved in left-to-right order
- Example:

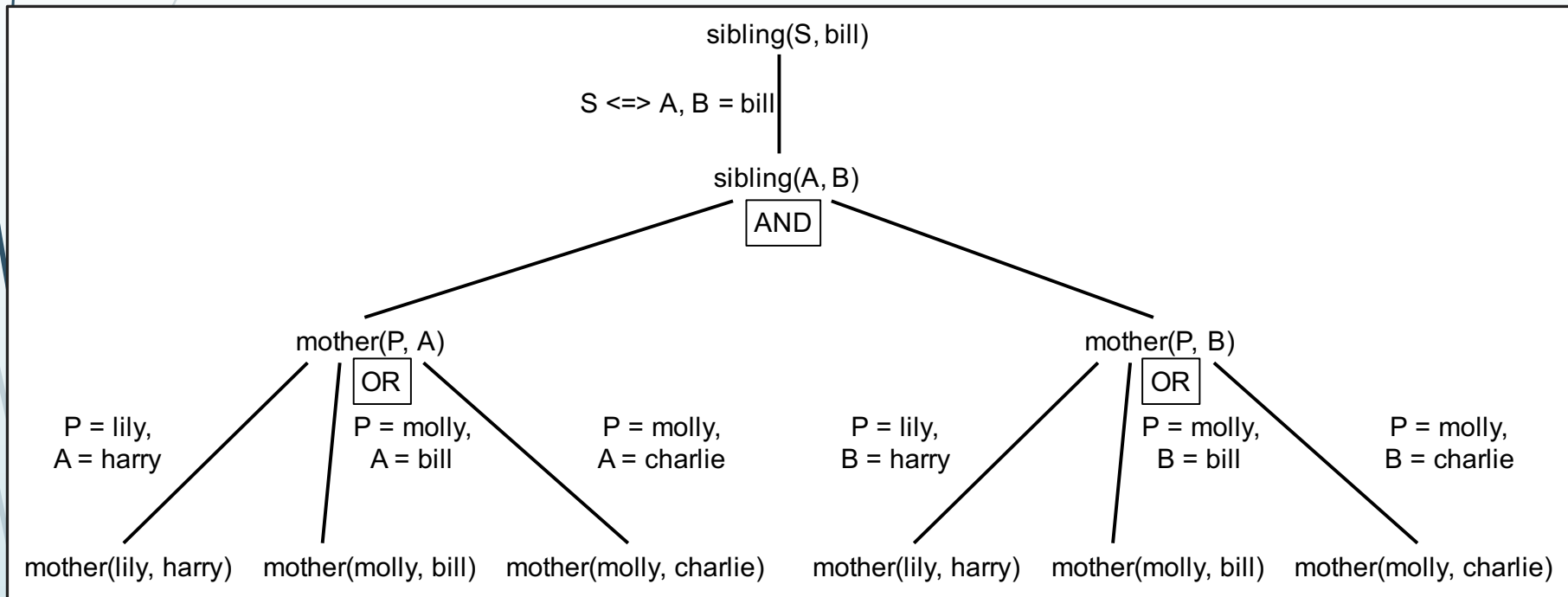
```
sibling(A, B) :- mother(P, A), mother(P, B).
```

```
mother(lily, harry).  
mother(molly, bill).  
mother(molly, charlie).
```

```
?- sibling(S, bill)  
S = bill
```

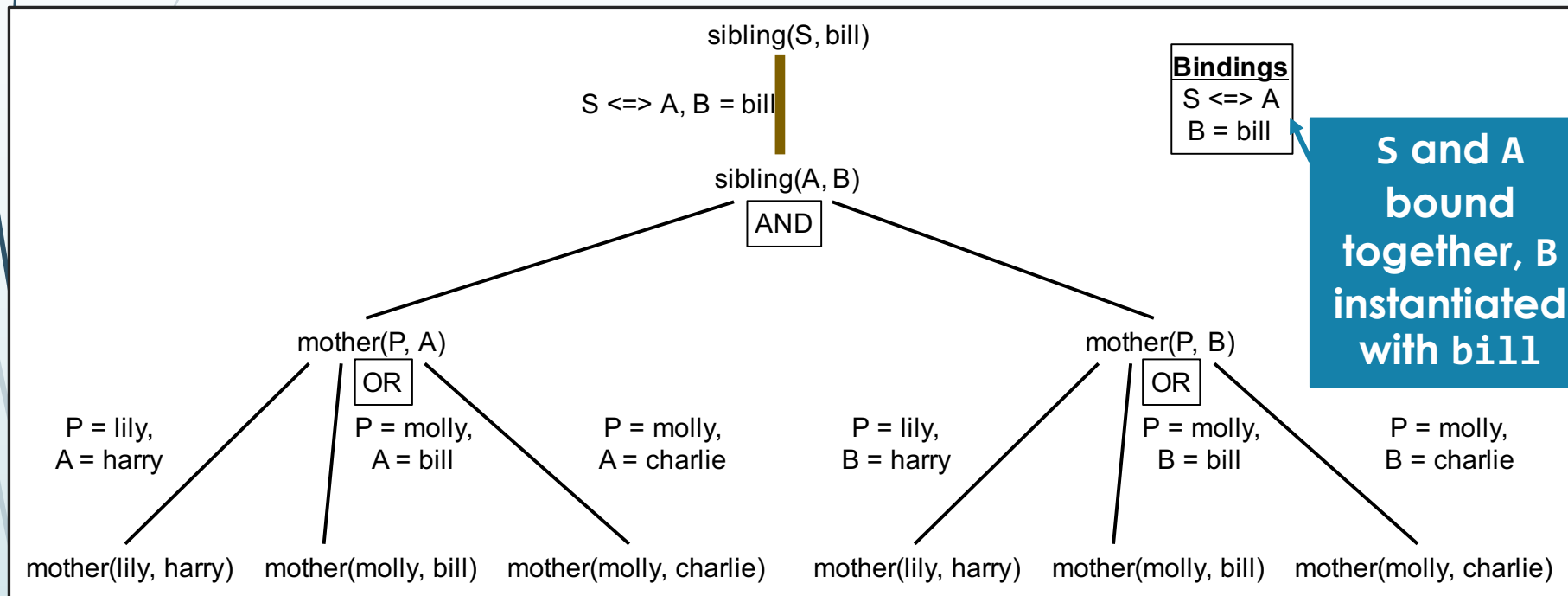
# Search Tree

- Search encounters choice points, and backtracking is required on failure or if the user asks for more solutions



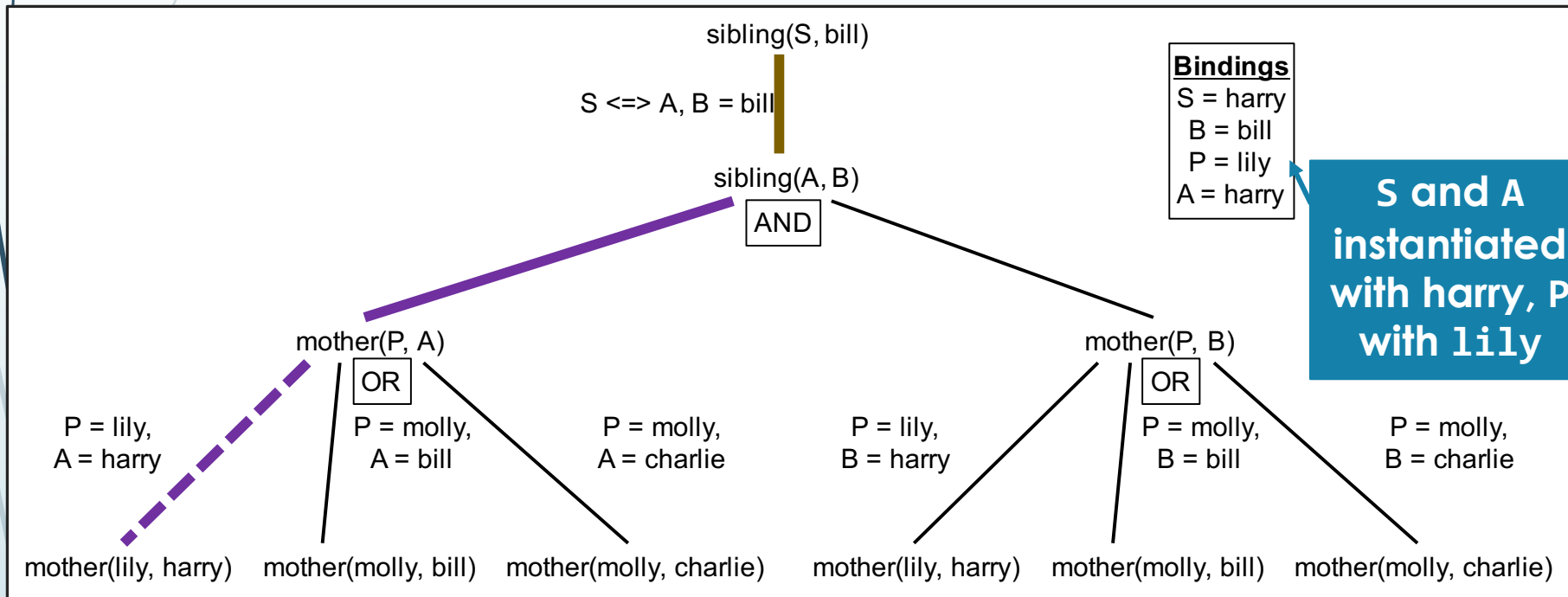
# Search Tree

- First, `sibling(S, bill)` is unified with the head term `sibling(A, B)`, and the body terms of the clause are added to the goals



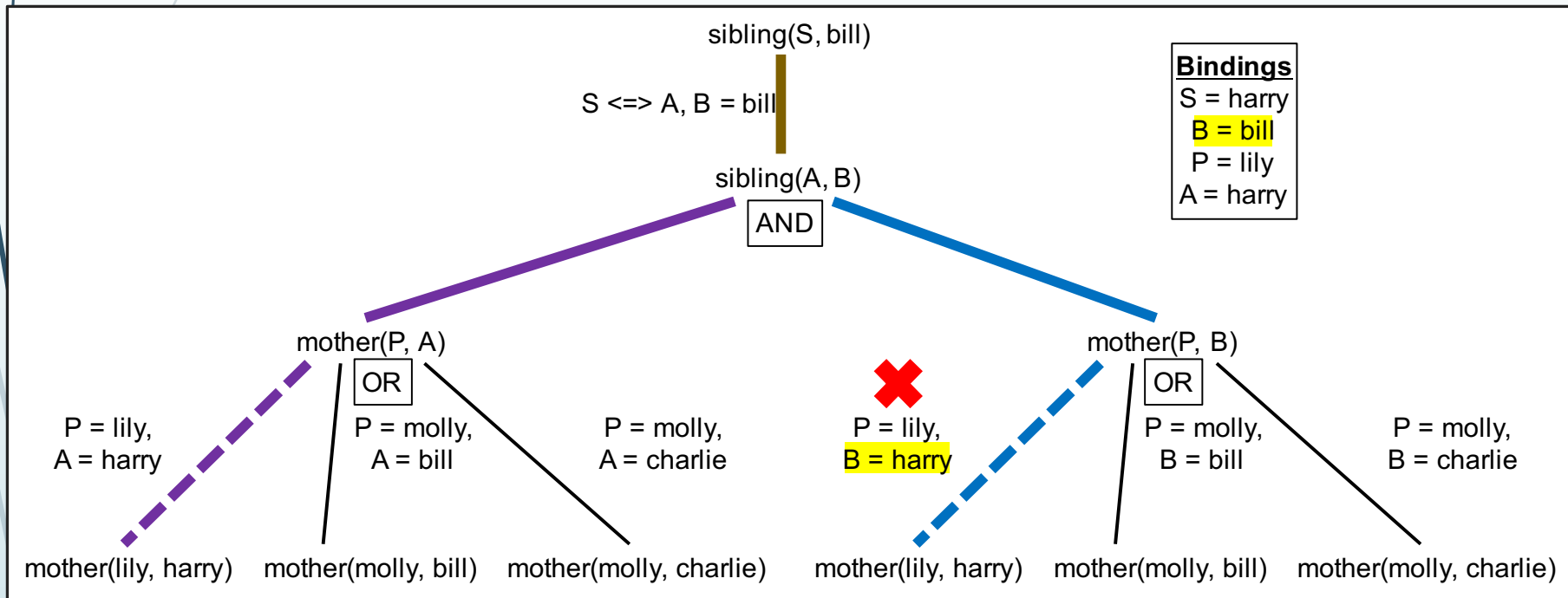
# Search Tree

- The goal `mother(P, A)` is solved first, with an initial choice of applying the fact `mother(lily, harry)`



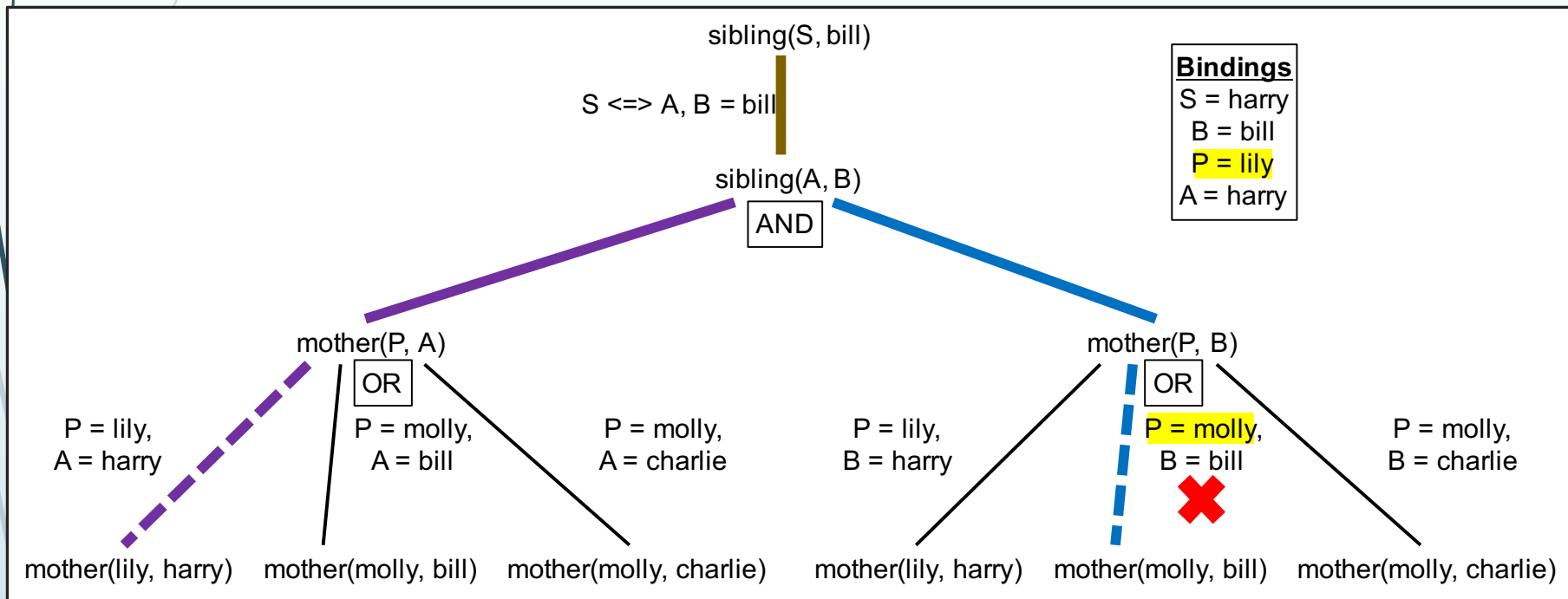
# Search Tree

- Then the goal `mother(P, B)` is solved, with an initial choice of applying the fact `mother(lily, harry)`
- However, unification of `B = bill` with `harry` fails



# Backtracking

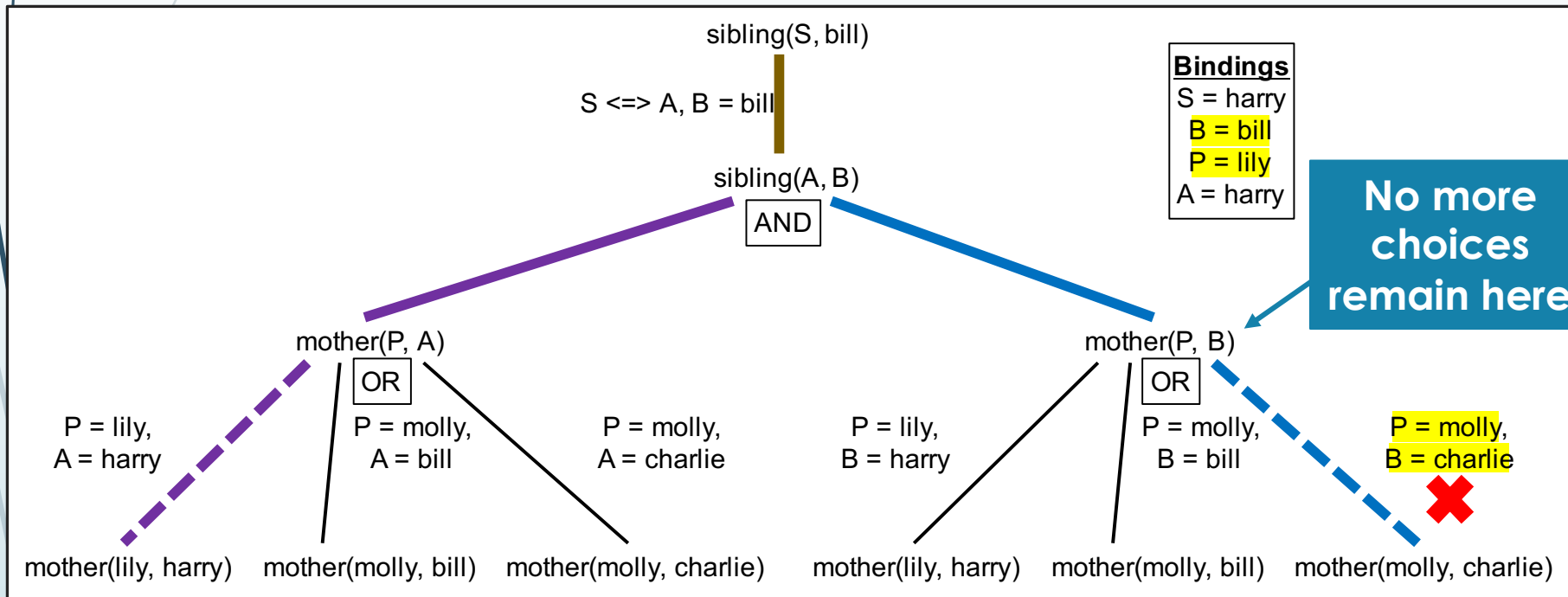
- The search backtracks to the previous choice point, attempting to apply the fact `mother(molly, bill)`
- However, unification of `P = lily` with `molly` fails





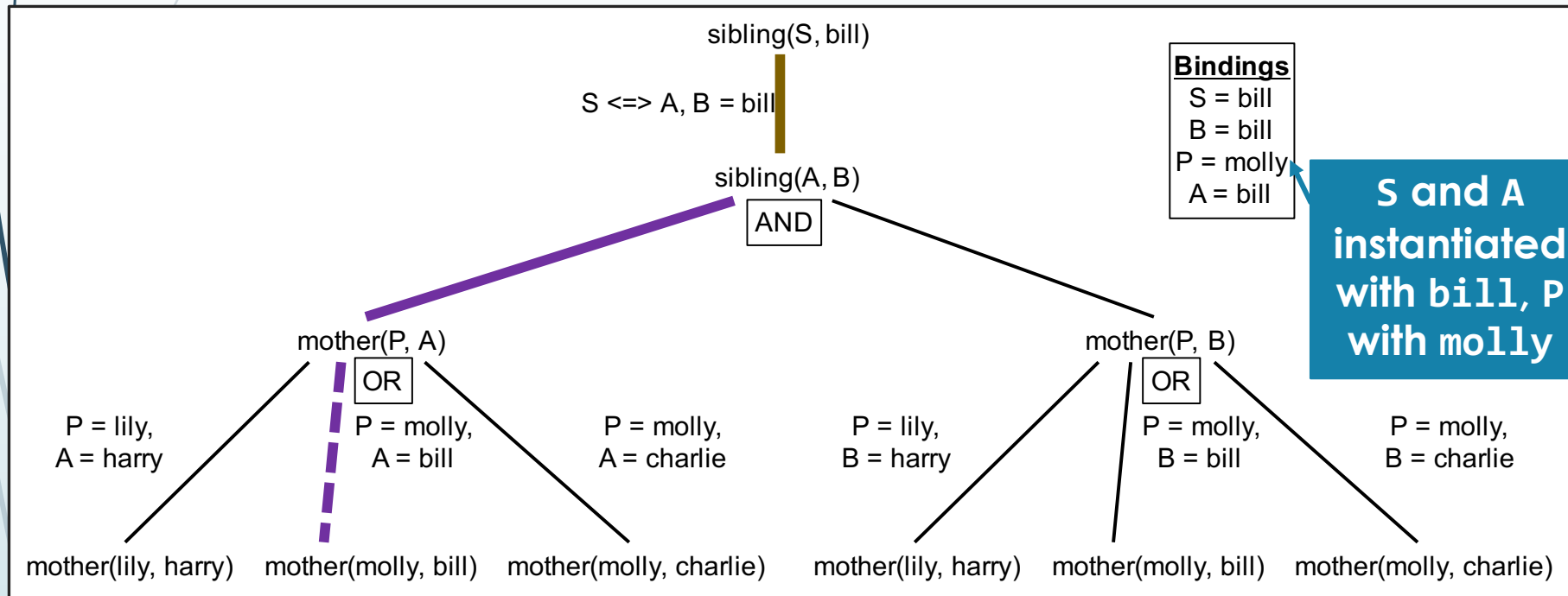
# Backtracking

- The search backtracks once again, attempting to apply the fact `mother(molly, charlie)`
- However, unification of `P = lily` with `molly` fails



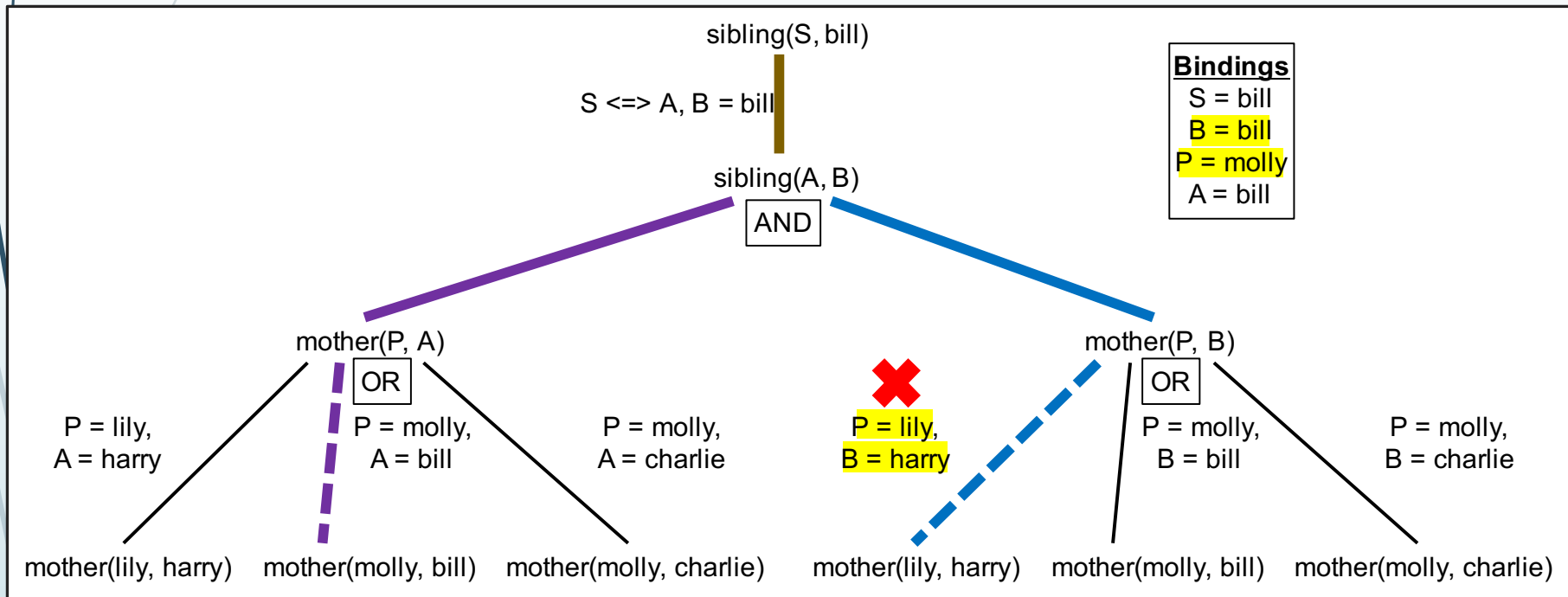
# Backtracking

- The search backtracks to the preceding choice point, unifying `mother(P, A)` with `mother(molly, bill)`



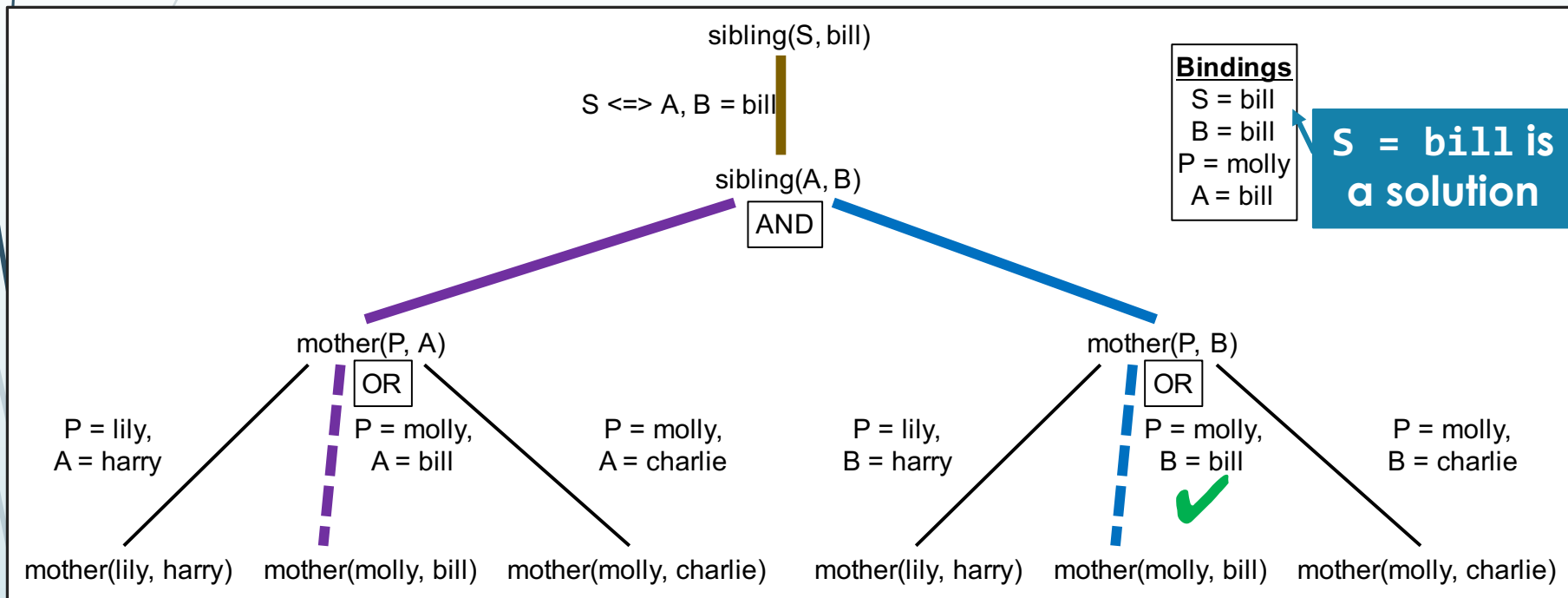
# Search Tree

- Then the goal `mother(P, B)` is solved, with an initial choice of applying the fact `mother(lily, harry)`
- However, unification of `B = bill` with `harry` fails



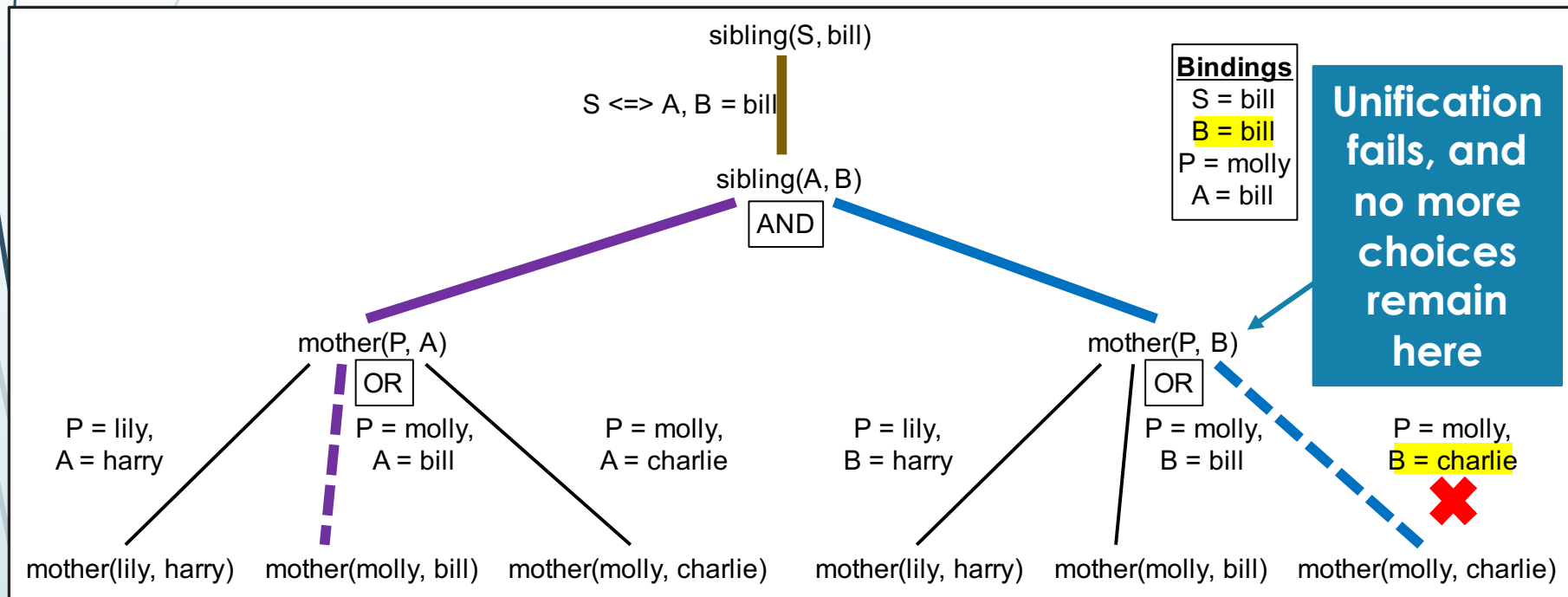
# First Solution

- The search backtracks to the previous choice point, attempting to apply the fact `mother(molly, bill)`
- Unification succeeds, and no goal terms remain



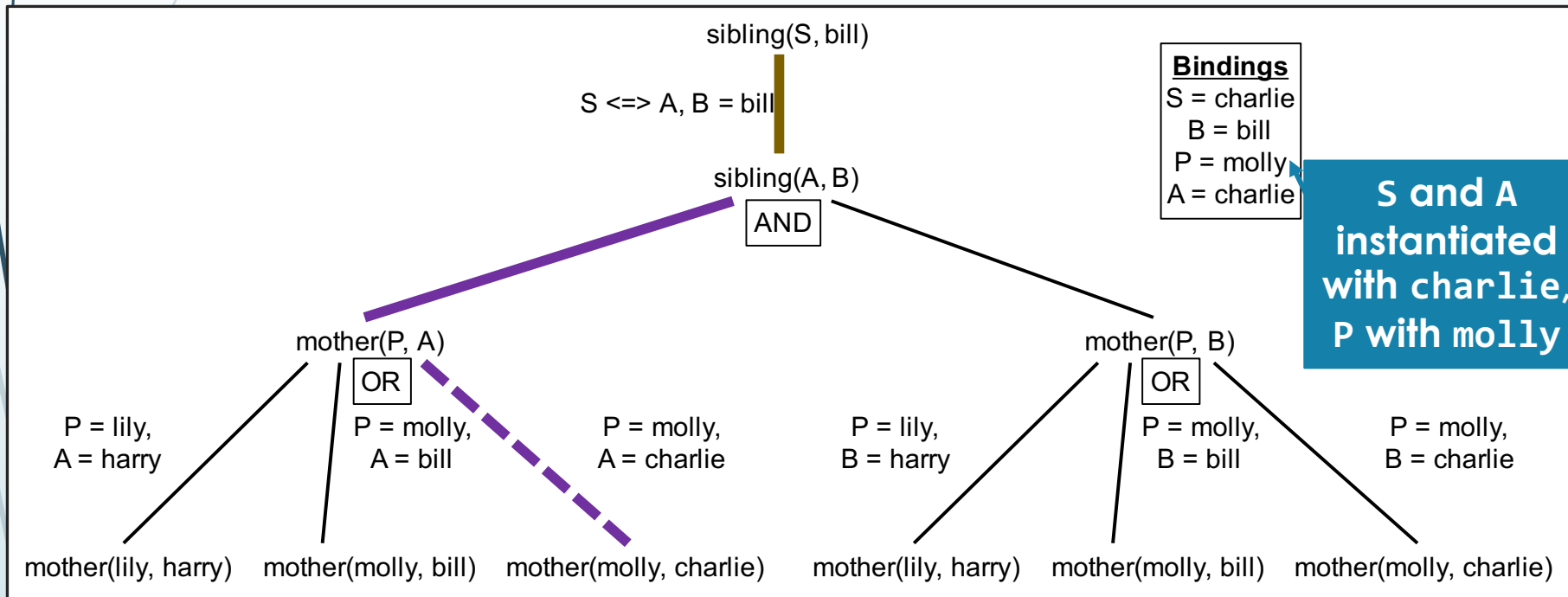
# Continuing the Search

- If we ask the interpreter for another solution, it backtracks to the previous choice point, attempting to apply the fact `mother(molly, charlie)`



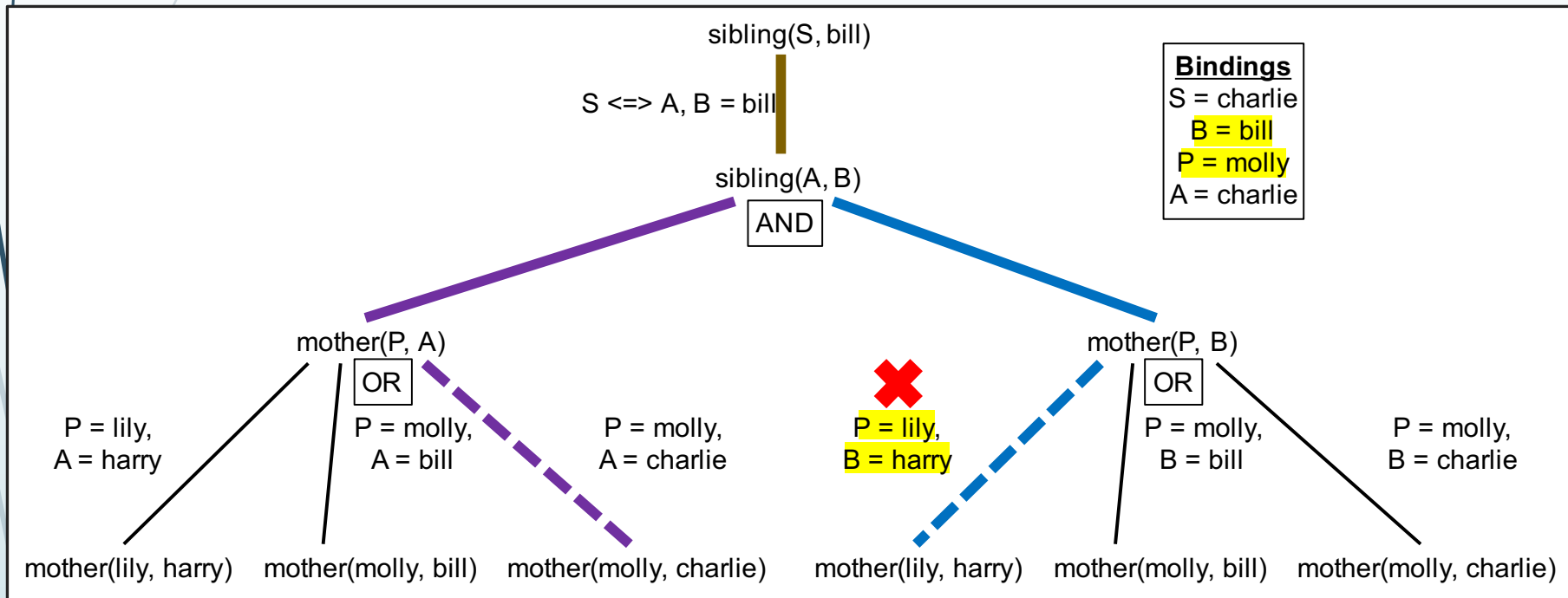
# Backtracking

- The search backtracks to the preceding choice point, unifying `mother(P, A)` with `mother(molly, charlie)`



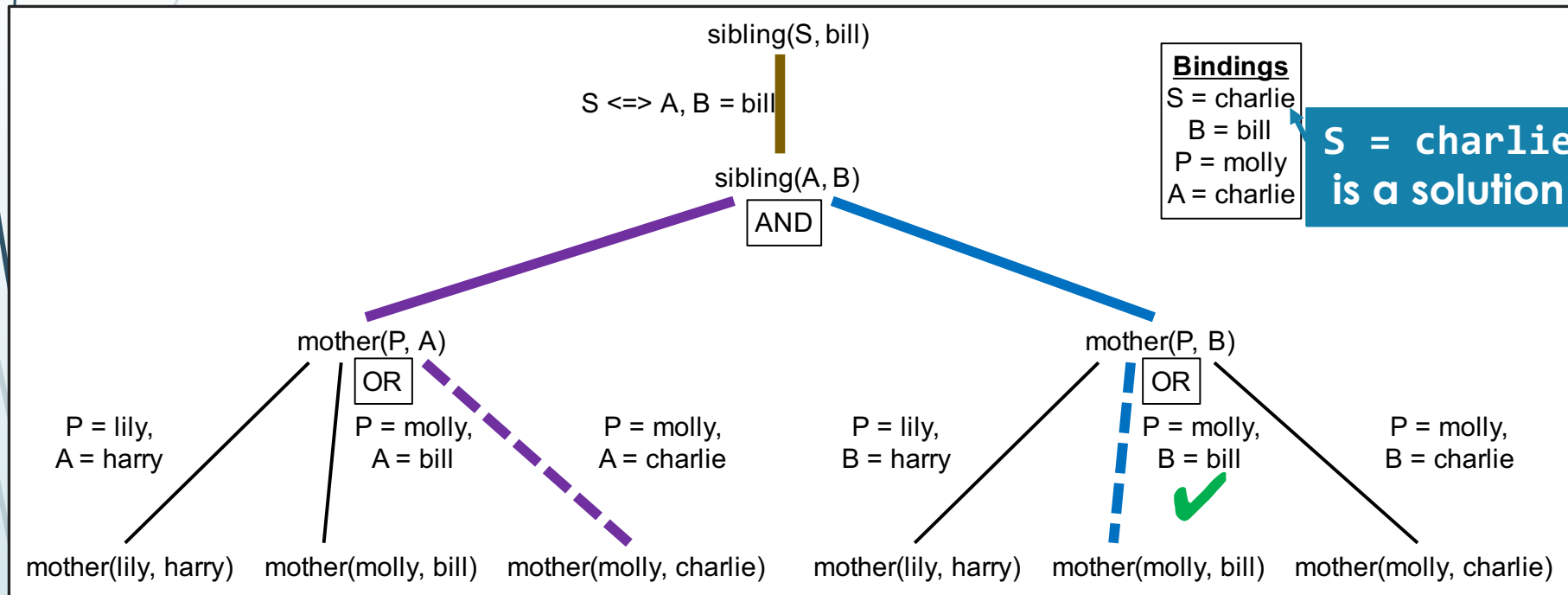
# Search Tree

- Then the goal `mother(P, B)` is solved, with an initial choice of applying the fact `mother(lily, harry)`
- However, unification of `B = bill` with `harry` fails



# Second Solution

- The search backtracks to the previous choice point, attempting to apply the fact `mother(molly, bill)`
- Unification succeeds, and no goal terms remain





# No More Solutions

- If we ask the interpreter for another solution, it backtracks to the previous choice point, attempting to apply the fact `mother(molly, charlie)`

Unification fails, and no more choices remain anywhere, so the search fails

sibling(S, bill)

$S \Leftarrow A, B = \text{bill}$

sibling(A, B)

AND

**Bindings**

S = charlie

**B = bill**

P = molly

A = charlie

mother(P, A)

OR

P = lily,  
A = harry

P = molly,  
A = bill

P = molly,  
A = charlie

mother(lily, harry)

mother(molly, bill)

mother(molly, charlie)

mother(P, B)

OR

P = lily,  
B = harry

P = molly,  
B = bill

P = molly,  
**B = charlie**

mother(lily, harry)

mother(molly, bill)

mother(molly, charlie)