

A Multi-phase Backtracking Approach to Solving Scope- Resolved MRS

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Demo

An Example World: A File System

- Individuals are files and folders
- Folders can contain files or other folders
- A user is in a “current folder”
- Individuals can be copied or deleted

What Might Be Said?

- Propositions and Yes/No Questions
 - Files are large.
 - Is a file in this folder not large?
- WH-Questions
 - Which files are in this folder?
 - What folder am I in?
- Commands
 - Delete <file>.
 - Copy <file> in <folder>.

How To Process and Respond?

- First: Find a solution to a scope-resolved MRS

How To Process and Respond?

- First: Find a solution to a scope-resolved MRS
- Propositions and Yes/No Questions: “Files are large”
 - True: “Yes, I agree!”
 - False: “No, that isn’t true”

How To Process and Respond?

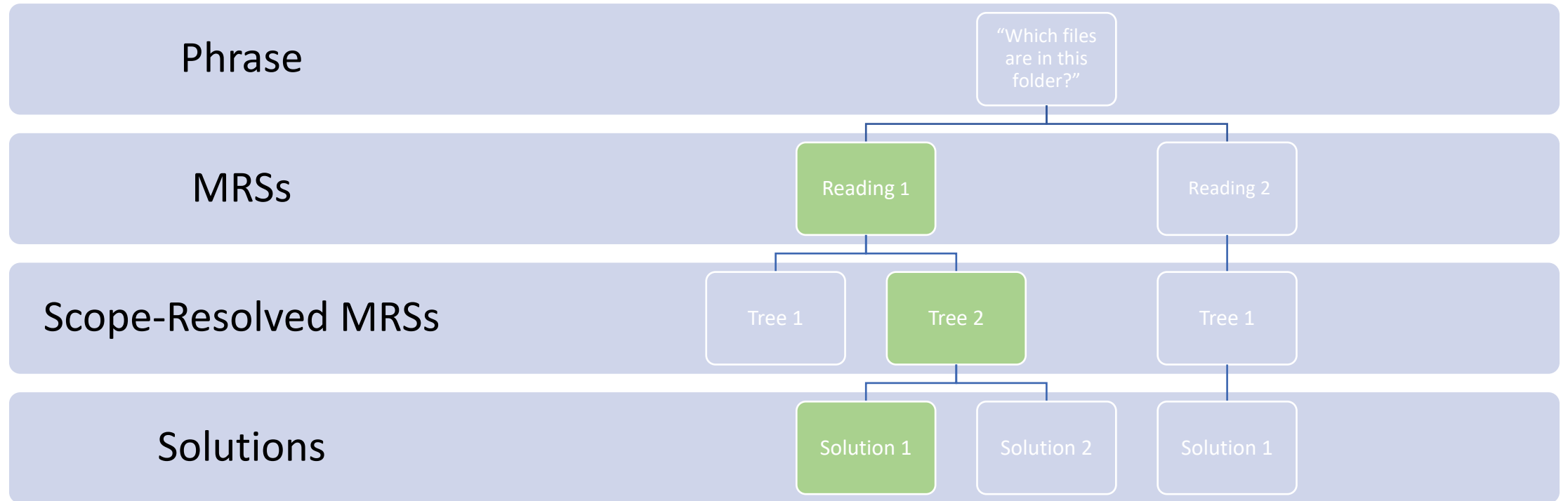
- First: Find a solution to a scope-resolved MRS
- Propositions and Yes/No Questions: “Files are large”
 - True: “Yes, I agree!”
 - False: “No, that isn’t true”
- WH-Questions: “Which files are in this folder?”
 - Find the variable scoped by `which_q(x, RSTR, BODY)`
 - Print the values of `x` from the (arbitrarily first) solution

How To Process and Respond?

- First: Find a solution to a scope-resolved MRS
- Propositions and Yes/No Questions: “Files are large”
 - True: “Yes, I agree!”
 - False: “No, that isn’t true”
- WH-Questions: “Which files are in this folder?”
 - Find the variable scoped by `which_q(x, RSTR, BODY)`
 - Print the values of `x` from the (arbitrarily first) solution
- Commands: “Delete <file>”
 - Perform operations* generated from the (arbitrarily first) solution

* “operations” are extra data added to state by action verbs

Choosing the “Right” Solution

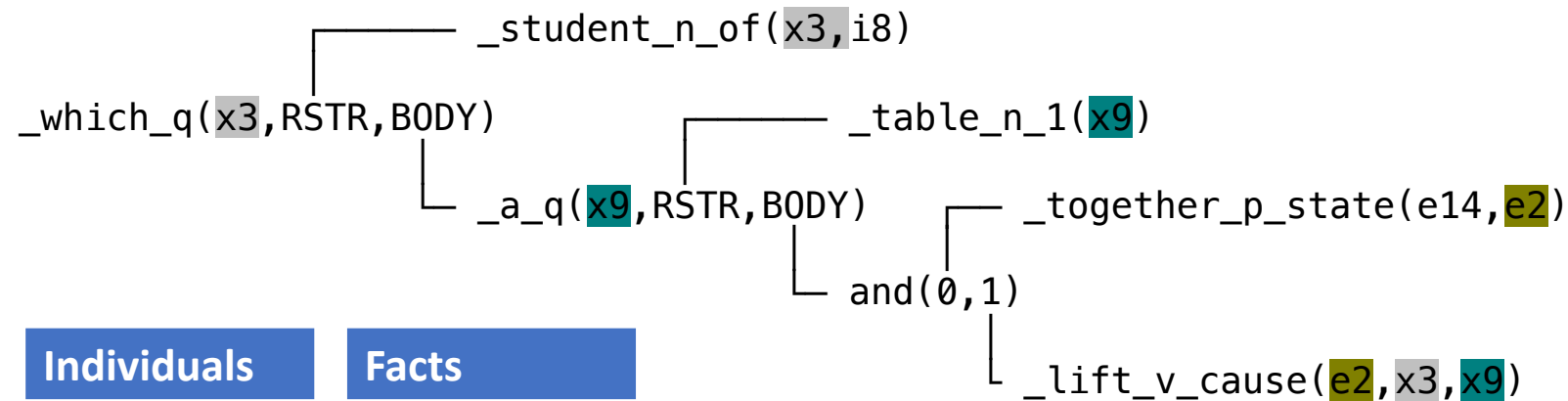


Heuristic: Respond using first solution that is found
... If no solution, respond with first failure

Solutions to Scope-Resolved MRS

“Which students are lifting a table together?”

- X variables always contain sets
- E variables are always a dictionary (name/value pairs)
- Scopal arguments form the shape of the tree



Individuals

Amir

Wan

table1

Facts

Amir and
Wan are
lifting table1
at the same
time

x3 [x PERS: 3 NUM: pl IND: +]

x9 [x PERS: 3 NUM: sg IND: +]

E2 [e SF: ques TENSE: pres

MOOD: indicative PROG: + PERF: -]

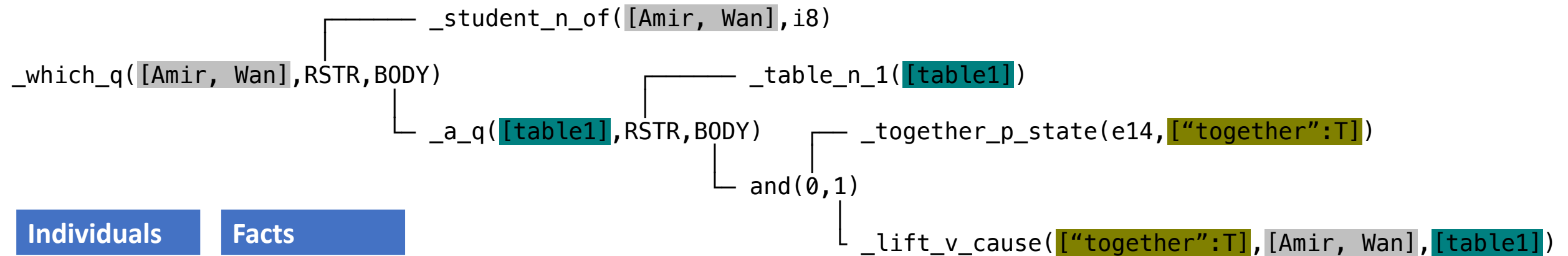
Solutions to Scope-Resolved MRS

“Which students are lifting a table together?”

- X variables always contain sets
- E variables are always a dictionary (name/value pairs)
- Scopal arguments form the shape of the tree

Solution

x3	[Amir, Wan]
x9	[table1]
e14	["together":T]



Individuals

Amir
Wan
table1

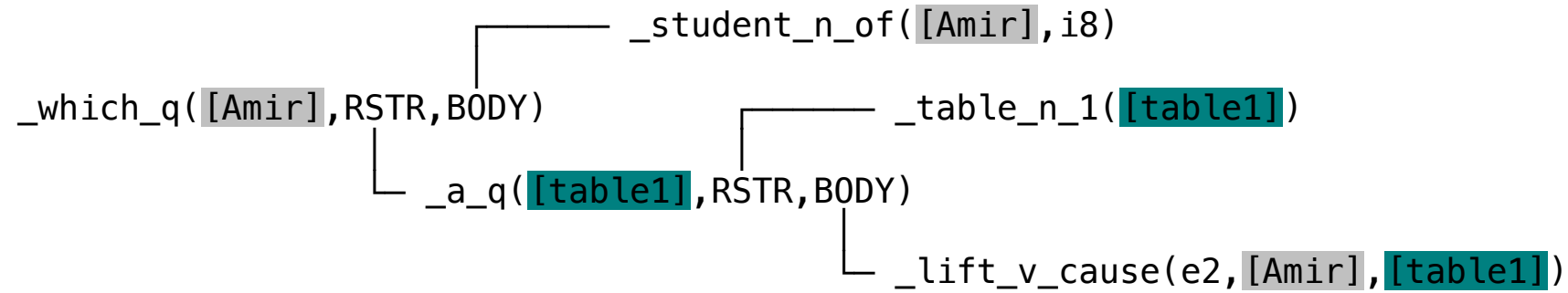
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```
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E2 [ e SF: ques TENSE: pres
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```

Solutions to Scope-Resolved MRS:

“Which students are lifting a table?”



Solution

x3	[Amir]
----	--------

x9	[table1]
----	----------

Individuals

Amir

Wan

table1

Facts

Amir and
Wan are
lifting table1
at the same
time

x3 [x PERS: 3 NUM: pl IND: +]

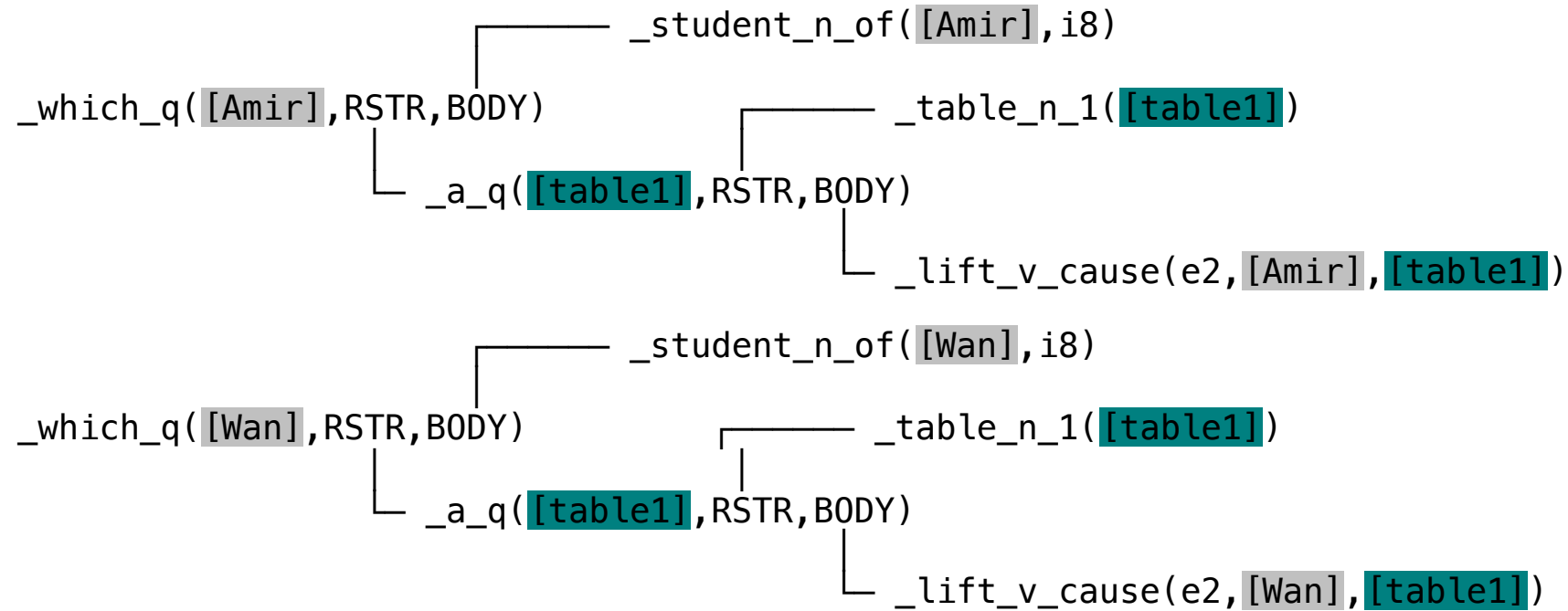
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E2 [e SF: ques TENSE: pres

MOOD: indicative PROG: + PERF: -]

Solutions to Scope-Resolved MRS:

“Which students are lifting a table?”



Solution Group	
Solution	
x3	[Amir]
x9	[table1]
Solution 2	
x3	[Wan]
x9	[table1]

Individuals	Facts
Amir	Amir and Wan are lifting table1 at the same time
Wan	
table1	

x3 [x PERS: 3 NUM: pl IND: +]
x9 [x PERS: 3 NUM: sg IND: +]
E2 [e SF: ques TENSE: pres
MOOD: indicative PROG: + PERF: -]

Finding Solutions to Scope-Resolved MRS: *A Multi-phase Backtracking Approach*

```
      ┌─── _folder_n_of(x9,i14)
undef_q(x9,RSTR,BODY)
      ┌─── _file_n_of(x3,i8)
      └─ undef_q(x3,RSTR,BODY)
          └─ _in_p_loc(e2,x3,x9)
```

- Quantifiers try every individual in their scoped variable iteratively

Finding Solutions to Scope-Resolved MRS: *A Multi-phase Backtracking Approach*

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      ┌── _folder_n_of(x9,i14)
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- Failures backtrack to the nearest quantifier and retry next individual

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```

- Quantifiers try every individual in their scoped variable iteratively
- Failures backtrack to the nearest quantifier and retry next individual
- When all predications are true, we have a solution

Finding Solutions to Scope-Resolved MRS: *A Multi-phase Backtracking Approach*

┌── _folder_n_of(x9,i14)
udef_q(x9,RSTR,BODY)
┌── _file_n_of(x3,i8)
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 └─ _in_p_loc(e2,x3,x9)

- Quantifiers try every individual in their scoped variable iteratively
- Failures backtrack to the nearest quantifier and retry next individual
- When all predications are true: a **solution**
- Global semantics (like plural counting) done in a second phase: a **solution group**

**many optimizations are available, but this is the base model*

Solving a Scope-Resolved MRS: Phase 1

┌── _folder_n_of(x9,i14)

State	

undef_q(x9,RSTR,BODY)

┌── _file_n_of(x3,i8)

└─ undef_q(x3,RSTR,BODY)

└─ _in_p_loc(e2,x3,x9)

All Individuals	Facts
mydocuments	mydocuments contains File1.txt and File2.txt
File1.txt	
File2.txt	

x3 [x PERS: 3 NUM: pl IND: +]

x9 [x PERS: 3 NUM: sg IND: +]

Solving a Scope-Resolved MRS: Phase 1

┌── _folder_n_of(x9,i14)

udef_q(x9,RSTR,BODY)

State

┌── _file_n_of(x3,i8)

└ udef_q(x3,RSTR,BODY)

└ _in_p_loc(e2,x3,x9)

All Individuals	Facts
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Solving a Scope-Resolved MRS: Phase 1

┌── _folder_n_of(x9,i14)

udef_q(x9,RSTR,BODY)

State

x9

mydocuments

┌── _file_n_of(x3,i8)

└ udef_q(x3,RSTR,BODY)

└ _in_p_loc(e2,x3,x9)

All Individuals

Facts

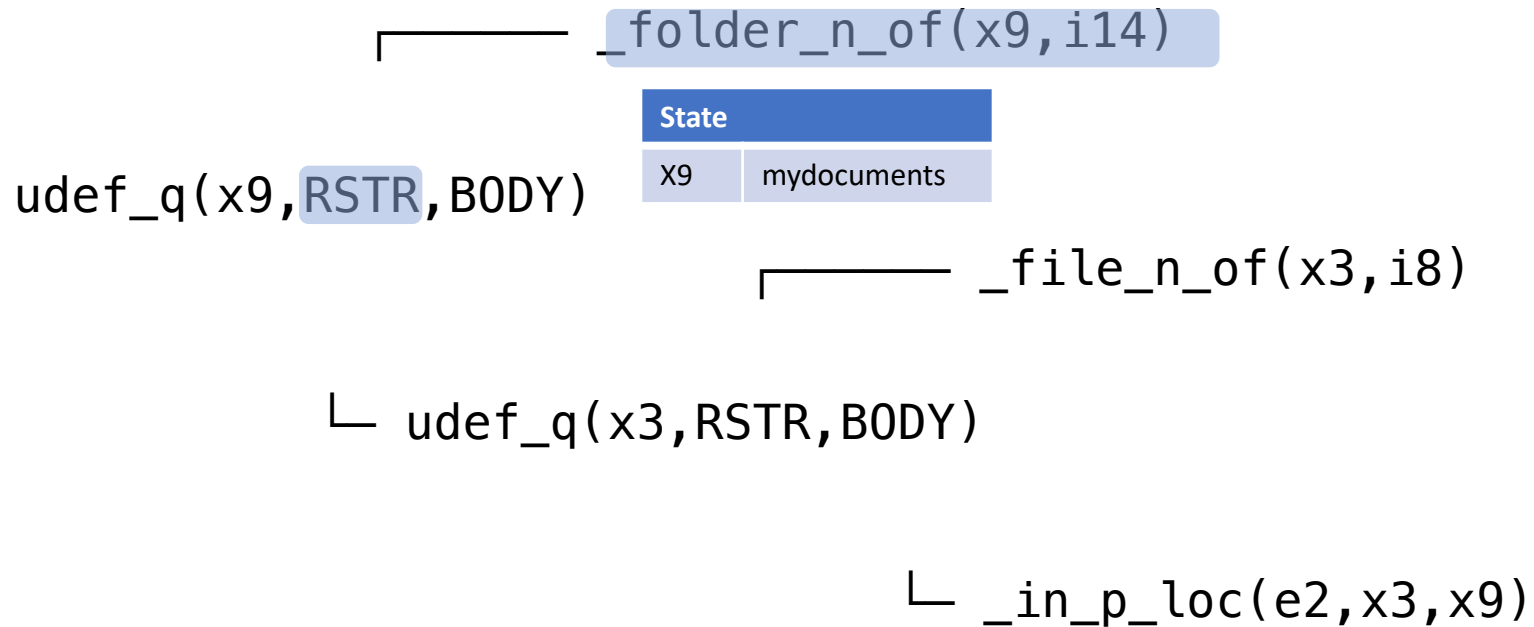
mydocuments

File1.txt

File2.txt

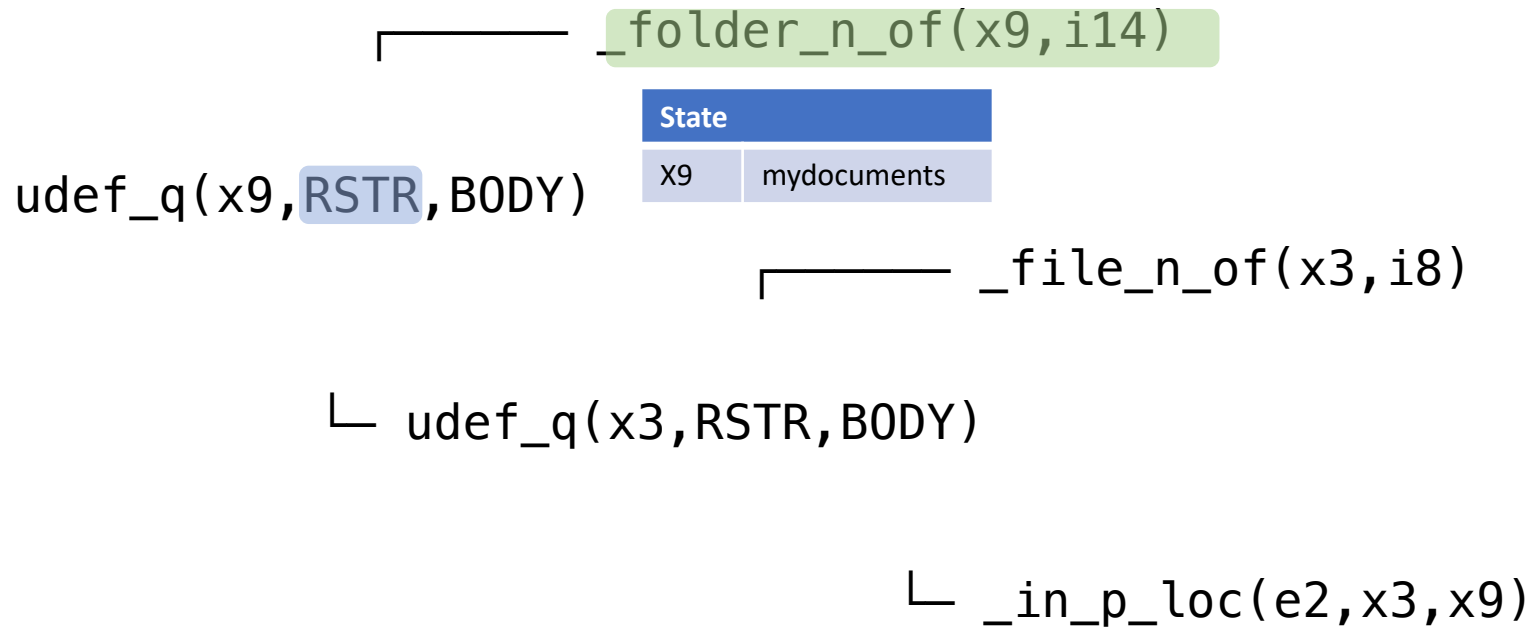
mydocuments contains
File1.txt and
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Solving a Scope-Resolved MRS: Phase 1



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Solving a Scope-Resolved MRS: Phase 1



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Solving a Scope-Resolved MRS: Phase 1

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State	
x9	mydocuments

┌── _file_n_of(x3,i8)

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└ _in_p_loc(e2,x3,x9)

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x9	mydocuments
x3	mydocuments

└─ _in_p_loc(e2,x3,x9)

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┌── _file_n_of(x3,i8)

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X9	mydocuments
X3	File1.txt

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File2.txt	

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X9	mydocuments
X3	File1.txt

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udef_q(x9,RSTR,BODY)

┌── _file_n_of(x3,i8)

└ udef_q(x3,RSTR,BODY)

State	
X9	mydocuments
X3	File1.txt

└ _in_p_loc(e2,x3,x9)

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Solving a Scope-Resolved MRS: Phase 1

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└ _in_p_loc(e2,x3,x9)

All Individuals	Facts
mydocuments	mydocuments contains File1.txt and File2.txt
File1.txt	
File2.txt	

Solving a Scope-Resolved MRS: Phase 1

Solution 1!

State	
X9	mydocuments
X3	File1.txt

└── _folder_n_of(x9,i14)

undef_q(x9,RSTR,BODY)

└── _file_n_of(x3,i8)

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┌── _file_n_of(x3,i8)

└─ undef_q(x3,RSTR,BODY)

└─ _in_p_loc(e2,x3,x9)

Solution 1!

State	
X9	mydocuments
X3	File1.txt

Solution 2!

State	
X9	mydocuments
X3	File2.txt

All Individuals	Facts
mydocuments	mydocuments contains File1.txt and File2.txt
File1.txt	
File2.txt	

Handling Plurals

- Both files (x3) and folders (x9) are plural
- Plurals, counting and other global (i.e. cross-solution) constraints are handled *after* solutions are found in Phase 2

Phase 2

All Solutions:

	X9	X3
Solution 1	Mydocuments	File1.txt
Solution 2	Mydocuments	File2.txt

Start with the full set of solutions

Phase 2

All Solutions:

	X9	X3
Solution 1	Mydocuments	File1.txt
Solution 2	Mydocuments	File2.txt

Group Being Tested:

	X9	X3
Solution 1	Mydocuments	File1.txt

Examine every combination of solutions to find those that meet constraints

Phase 2

All Solutions:

	X9	X3
Solution 1	Mydocuments	File1.txt
Solution 2	Mydocuments	File2.txt

Group Being Tested:

	X9 greater than 1	X3 greater than 1
	X9	X3
Solution 1	Mydocuments	File1.txt

Phase 2

All Solutions:

	X9	X3
Solution 1	Mydocuments	File1.txt
Solution 2	Mydocuments	File2.txt

Group Being Tested:

	X9 greater than 1	X3 greater than 1
	X9	X3
Solution 2	Mydocuments	File2.txt

Phase 2

All Solutions:

	X9	X3
Solution 1	Mydocuments	File1.txt
Solution 2	Mydocuments	File2.txt

Group Being Tested:

	X9 greater than 1	X3 greater than 1
	X9	X3
Solution 1	Mydocuments	File1.txt
Solution 2	Mydocuments	File2.txt

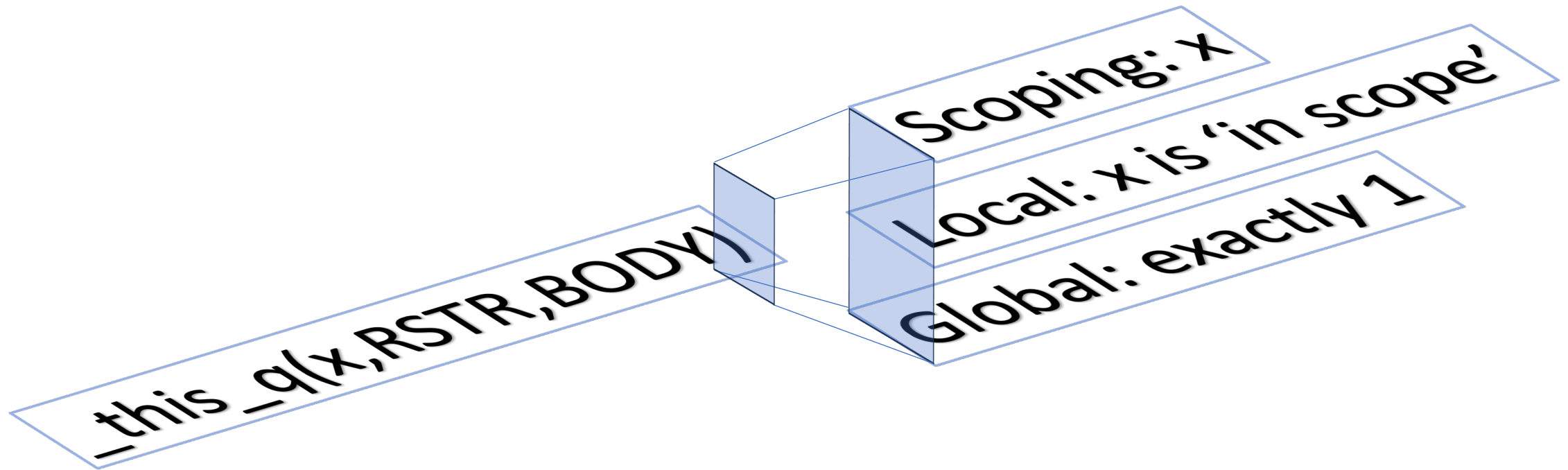
Response to “files are in folders”

- “files are not in folders”
 - ... because “folders” is plural and no solution groups have > 1 folder
- Successful Groups
 - Create *solution groups* that meet the constraints
 - Solution groups are the actual solution to the scope-resolved MRS

Predication “Semantic Layers”

_this_q(x,RSTR,BODY)

Predication “Semantic Layers”



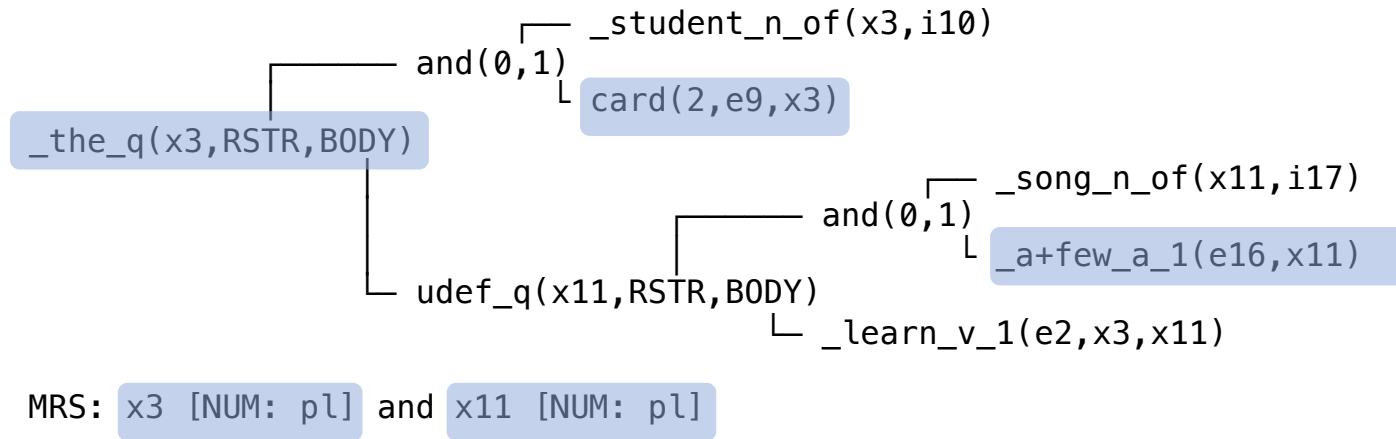
Predication “Semantic Layers”

Predications can contribute any combination of:
scoping, local or global constraints

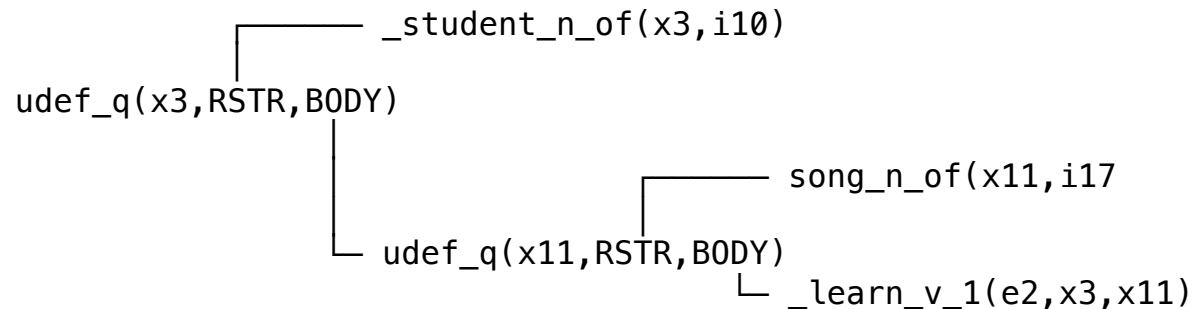
Predicate	Scoping	Local	Global
_large_a_1(e,x)	<none>	True for “large” x	<none>
undef_q(x,RSTR,BODY)	x	<none>	<none>
_a_q(x,RSTR,BODY)	x	<none>	Exactly 1
_the_q(x,RSTR,BODY)* *... one of several meanings	x	<none>	1 or more Where all rstr satisfy the body
_this_q(x,RSTR,BODY)	x	True if x is “in scope”* *... among other meanings	Exactly 1
card(CARG,e,x)	<none>	<none>	At least CARG
a_few_a_1(e,x)	<none>	<none>	Between 3 and 5* *top value is debatable
and_c(x,x1,x2)	<none>	<none>	Exactly N where N is total of x1 and x2

Phase 1: Solve After Removing Global Constraints

“The two students learned a few songs”

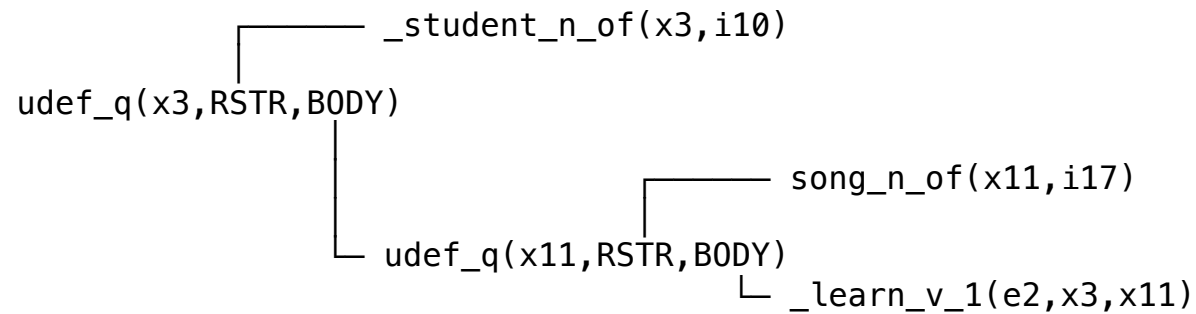


“student(s) learned song(s)”



Phase 1: Solve After Removing Global Constraints

” student(s) learned song(s)”

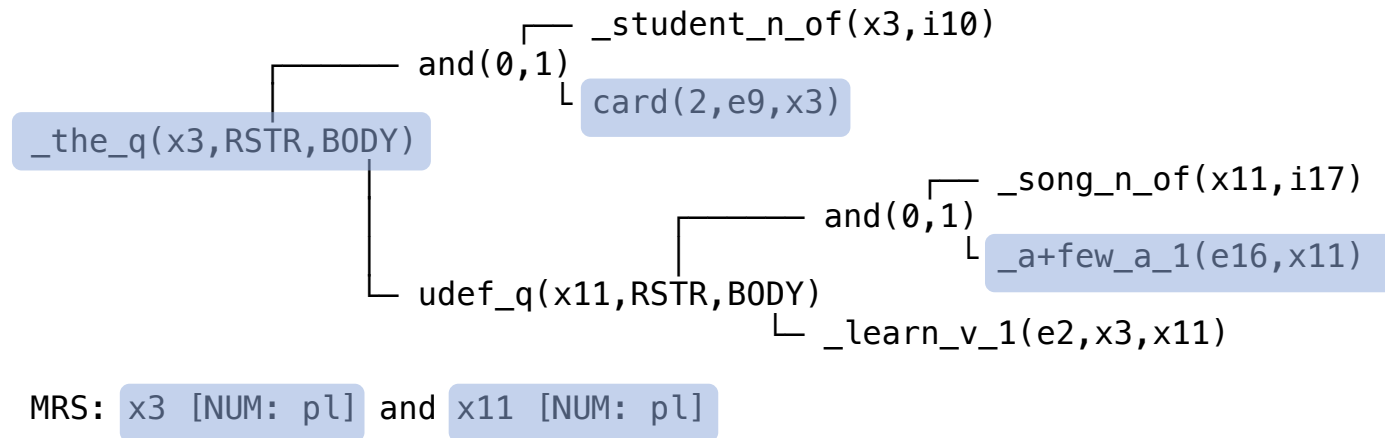


All Solutions:

	X3	X11
Solution 1	Diya	”Words Get in the Way”
Solution 2	Diya	”More than Words”
Solution 3	Wan	”Ten Thousand Words”

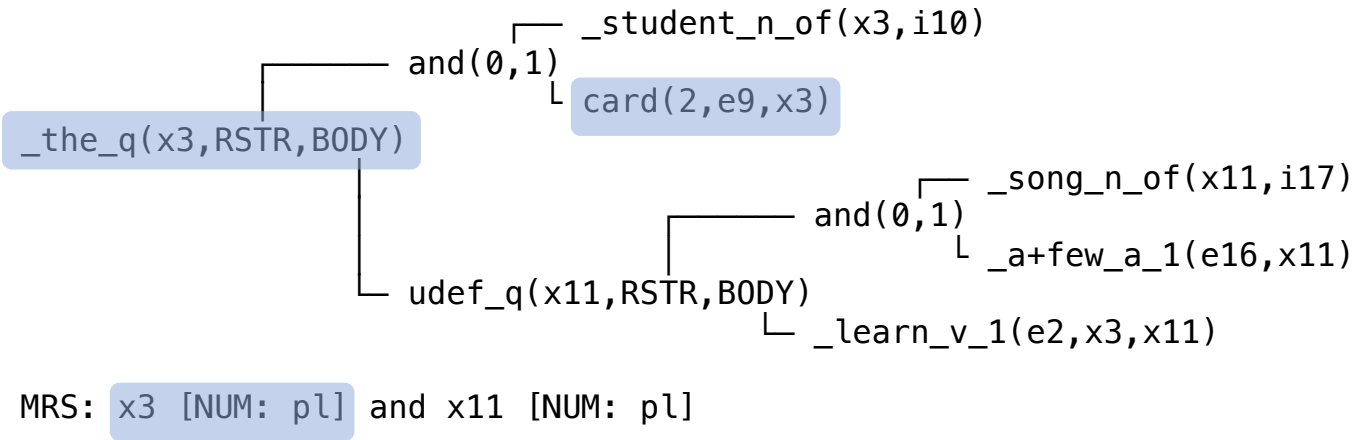
Phase 2: Find Global Constraints For Variables

“The two students learned a few songs”



Phase 2: Find Global Constraints For Variables

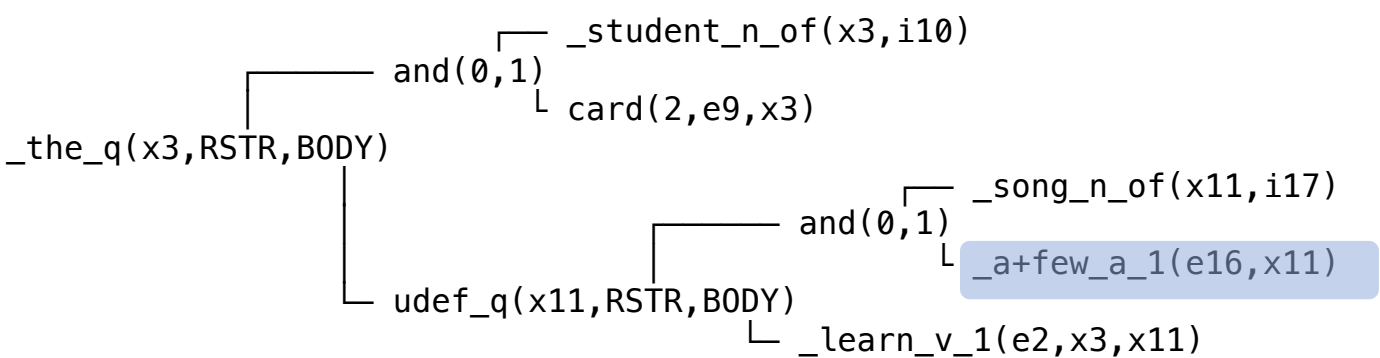
”The two students learned a few songs”



X3 Predications	Constraints
<code>card(2, e9, x3)</code>	Min=2, Max=inf
<code>_the_q(x3, RSTR, BODY)</code>	Min=1, Max=inf and all_rstr_meet_body
<code>x3 [NUM: pl]</code>	Min=2, Max=inf
	Min=2, Max=inf and all_rstr_meet_body

Phase 2: Find Global Constraints For Variables

”The two students learned a few songs”



MRS: x3 [NUM: p1] and x11 [NUM: p1]

X11 Predications	Constraints
_a+few_a_1(e16, x11)	Min=3, Max=5
x11 [NUM: p1]	Min=2, Max=inf
	Min=3, Max=5

Phase 2: Find Solution Groups that Meet Constraints

“The two students learned a few songs”

All Solutions:

	X3	X11
Solution 1	Diya	“Words Get in the Way”
Solution 2	Diya	“More than Words”
Solution 3	Wan	“Ten Thousand Words”

Group Being Tested:

	X3: Min=2, Max=inf and all_rstr_meet_body		X11: Min=3, Max=5	
	X3		X11	
Solution 1	Diya		“Words Get in the Way”	

*All other single solution groups fail for the same reason, not shown

Phase 2: Find Solution Groups that Meet Constraints

“The two students learned a few songs”

All Solutions:

	X3	X11
Solution 1	Diya	“Words Get in the Way”
Solution 2	Diya	“More than Words”
Solution 3	Wan	“Ten Thousand Words”

Group Being Tested:

	X3: Min=2, Max=inf and all_rstr_meet_body	X11: Min=3, Max=5
	X3	X11
Solution 1	Diya	“Words Get in the Way”
Solution 3	Wan	“Ten Thousand Words”

*All other double solution groups fail for various reasons, not shown

Phase 2: Find Solution Groups that Meet Constraints

”The two students learned a few songs”

All Solutions:

	X3	X11
Solution 1	Diya	”Words Get in the Way”
Solution 2	Diya	”More than Words”
Solution 3	Wan	”Ten Thousand Words”

Group Being Tested:

	X3: Min=2, Max=inf and all_rstr_meet_body	X11: Min=3, Max=5
	X3	X11
Solution 1	Diya	”Words Get in the Way”
Solution 2	Diya	”More than Words”
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Collective, Distributive, Cumulative

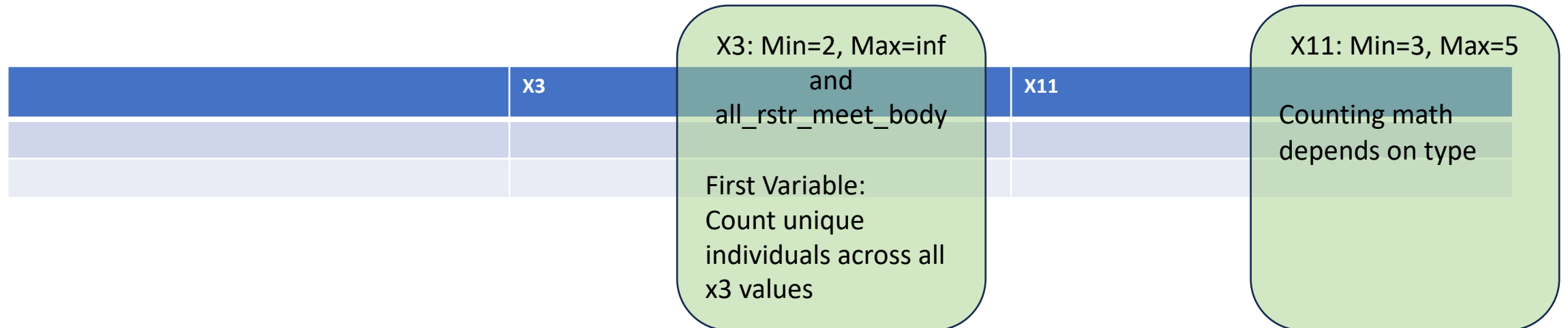
"The two students learned a few songs"

- This solution group is a **cumulative** reading
- Phase 2 checks the constraints for all three types of readings

	X3: Min=2, Max=inf and all_rstr_meet_body	X11: Min=3, Max=5
	X3	X11
Solution 1	Diya	"Words Get in the Way"
Solution 2	Diya	"More than Words"
Solution 3	Wan	"Ten Thousand Words"

Collective, Distributive, Cumulative Math

- Variables have an order due to forward and reverse readings
- Count *this* variable per *the previous variable*
- *How* to count depends on type
- First variable always counted the same (since no previous variable)



Distributive: “The two students sang a few songs”

- Students: must be grouped distributively into subgroups:
 - More than one subgroup
 - The total of students across the subgroups must add up to two
- Songs: Each student subgroup must be singing a few songs

	x3	X3: Min=2, Max=inf and all_rstr_meet_body	x11	X11: Min=3, Max=5
Solution	[Diya]	First Variable Counting: Count unique individuals across all x3 values	["Words Get in the Way"]	Distributive Counting: 3-5 x11 <i>individuals</i> per x3 <i>set value</i>
Solution	[Diya]		["More than Words"]	
Solution	[Diya]		["Ten Thousand Words"]	
Solution	[Wan]		["Word Up"]	
Solution	[Wan]		["Paperback Writer"]	
Solution	[Wan]		["Unwritten"]	

Collective: “The two students sang a few songs”

- Students must be grouped collectively:
 - Exactly 1 “subgroup” that contains the entire set of students
- Songs : Each student subgroup must be singing a few songs

	X3	X3: Min=2, Max=inf and all_rstr_meet_body	X11	X11: Min=3, Max=5
Solution	[Diya, Wan]		["Words Get in the Way"]	
Solution	[Diya, Wan]		["More than Words"]	
Solution	[Diya, Wan]		["Ten Thousand Words"]	
		First Variable Counting: Count unique individuals across all x3 values		Collective Counting: - <i>exactly one</i> x3 set - 3-5 x11 <i>individuals</i> for the one x3 set
	X3		X11	
Solution	[Diya, Wan]		["Words Get in the Way", "More than Words"]	
Solution	[Diya, Wan]		["Ten Thousand Words"]	
	X3		X11	
Solution	[Diya, Wan]		["Words Get in the Way", "More than Words", "Ten Thousand Words"]	

Cumulative: “The two students sang a few songs”

- Students: must be grouped distributively into subgroups, which means:
 - More than one subgroup
 - The total of students across the subgroups must add up to two
- Songs: The total of songs across all subgroups must be a few

	X3	X3: Min=2, Max=inf and all_rstr_meet_body	X11	X11: Min=3, Max=5
Solution	[Diya]		["Words Get in the Way"]	Cumulative
Solution	[Diya]		["More than Words"]	Counting:
Solution	[Wan]	First Variable	["Ten Thousand Words"]	3-5 x11 <i>individuals</i>
		Counting: Count		across all x3
		unique individuals		subgroups
		across all x3 values		
	X3		X11	
Solution	[Diya]		["Words Get in the Way", "More than Words"]	
Solution	[Wan]		["Ten Thousand Words"]	

Summary

- Phase 0: Generate MRS and scope-resolved MRS
- Phase 1: Find solutions using scope-resolved MRS minus global constraints
- Phase 2: Find solution groups using global constraints
- Phase 3: Respond using the first solution group (or error)
 - If no solutions: “<error>”
 - Propositions and Yes/No Questions: “Files are large”
 - “Yes, I agree!”
 - WH-Questions: “Which files are in this folder?”
 - Find the variable scoped by which_q(x, RSTR, BODY)
 - Respond with the values of x from the solution group
 - Commands: “Delete <file>”
 - Perform operations* generated from the solution group

* “operations” are extra data added to state by action verbs

*optimization: Individual solutions are pulled through the phases in a pipeline

Questions?