

Answer Update for Rule-based Stream Reasoning

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FAKULTÄT
FÜR INFORMATIK
Faculty of Informatics



Overview

LARS: Logic-based Framework for
Analyzing **R**easoning over **S**tream.

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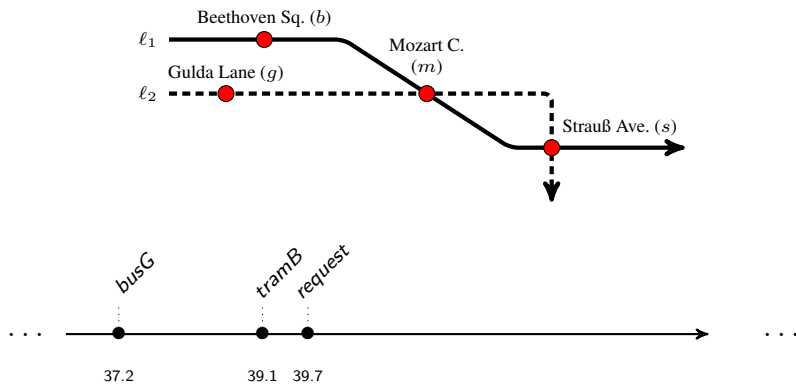
⇒ **Incremental algorithm** for computing
answer streams of **stream-stratified** LARS
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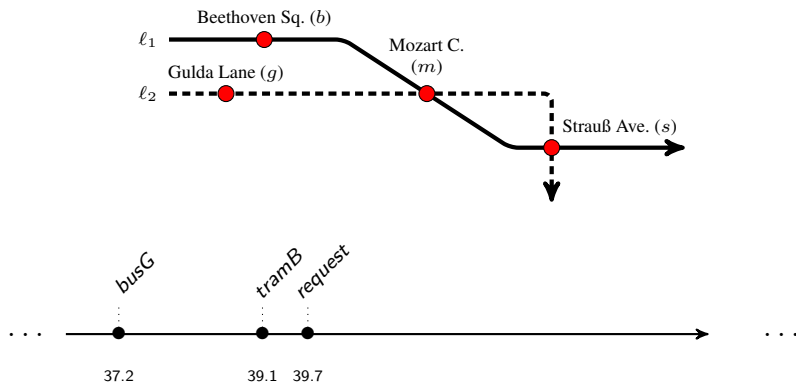
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LARS in a Nutshell

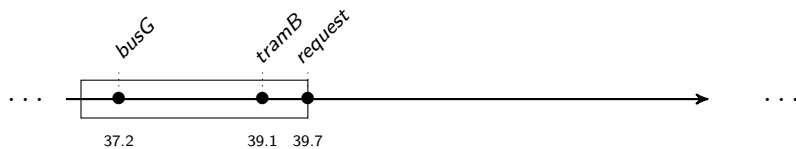
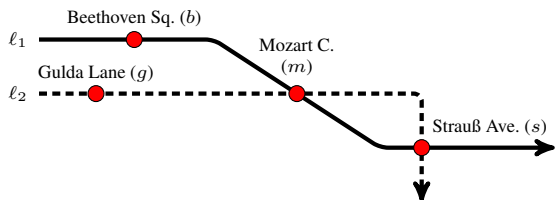


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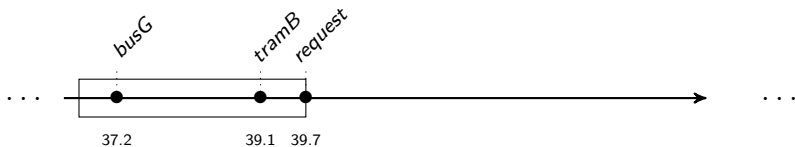
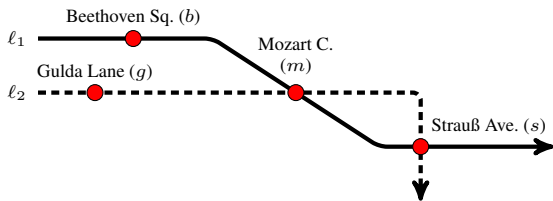
@ $_{37.2m}$ busG

LARS in a Nutshell



$$\boxplus^{3m} @_{37.2m} busG$$

LARS in a Nutshell



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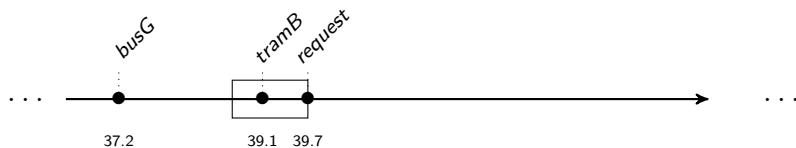
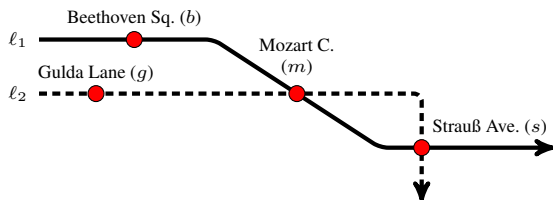
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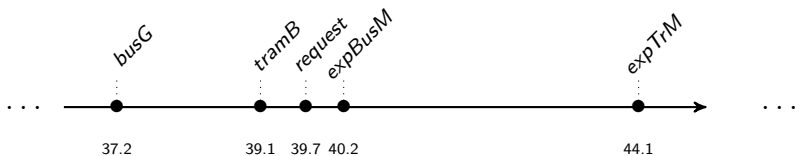
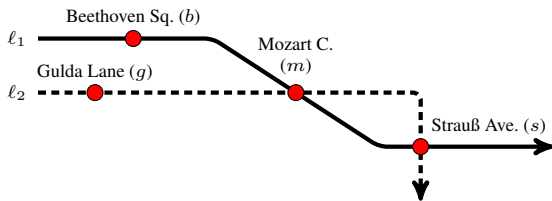
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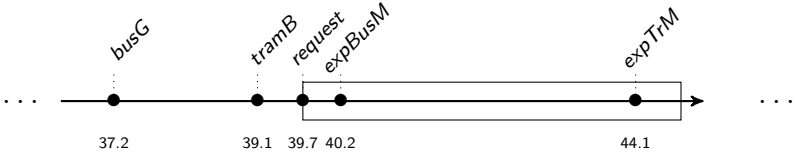
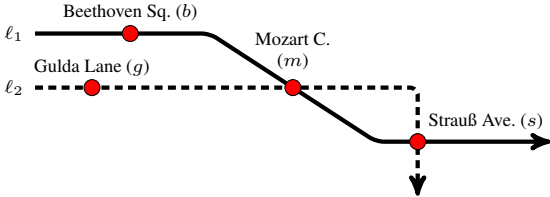
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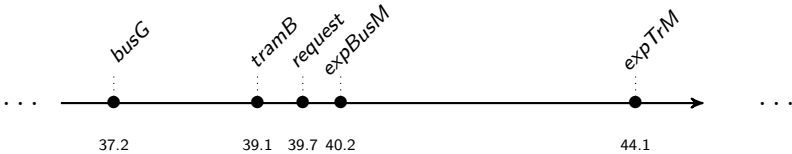
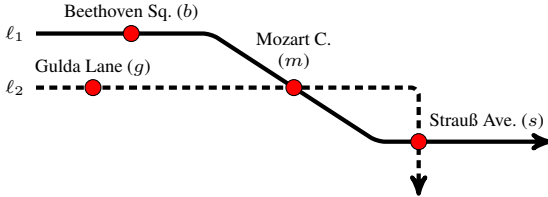
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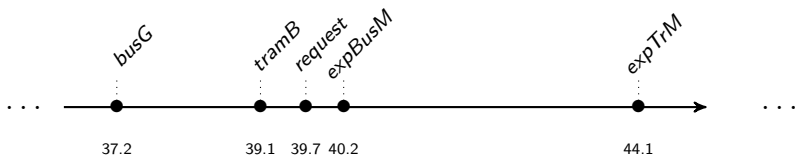
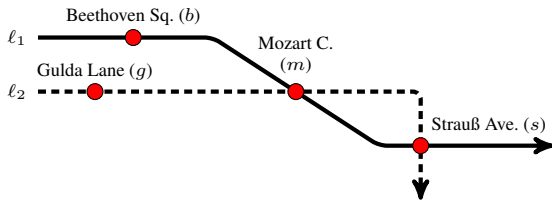
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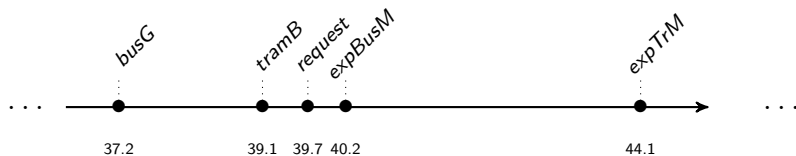
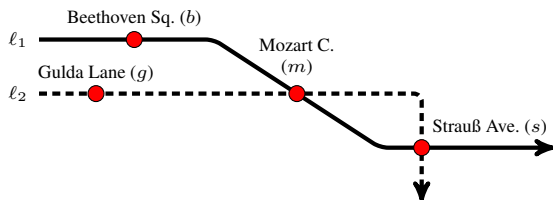
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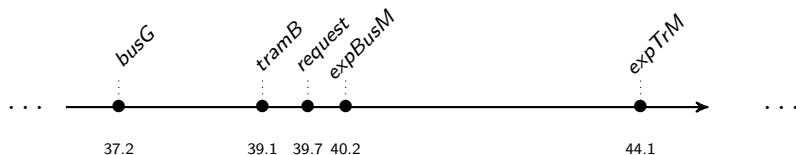
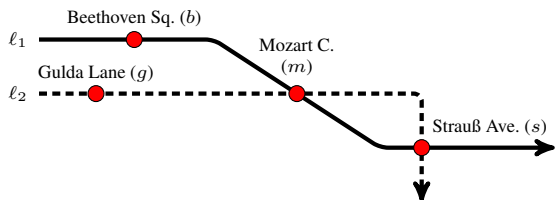
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LARS in a Nutshell



$$I_1 = \left\{ \begin{array}{l} 37.2 \mapsto \{busG\}, 39.1 \mapsto \{tramB\}, \\ 39.7 \mapsto \{request, on, takeBusM\}, \\ 40.2 \mapsto \{expBusM\}, 44.1 \mapsto \{expTrM\} \end{array} \right\}$$

LARS in a Nutshell

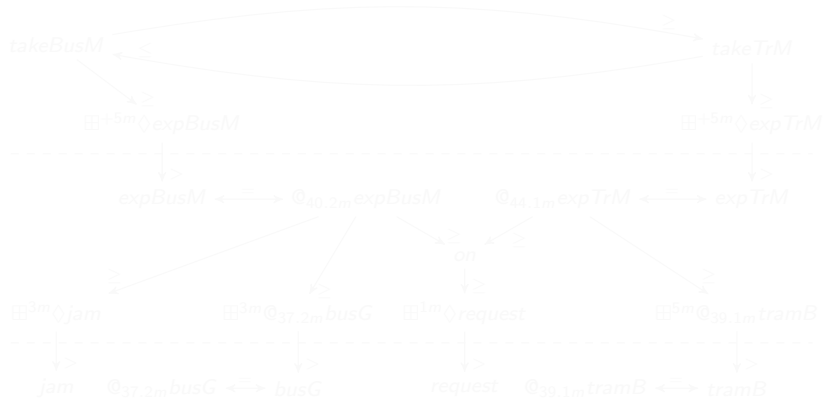


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Stream-stratified LARS Programs



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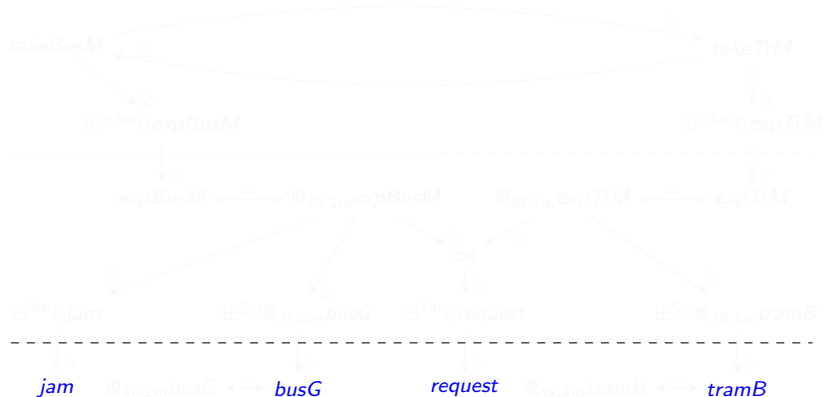
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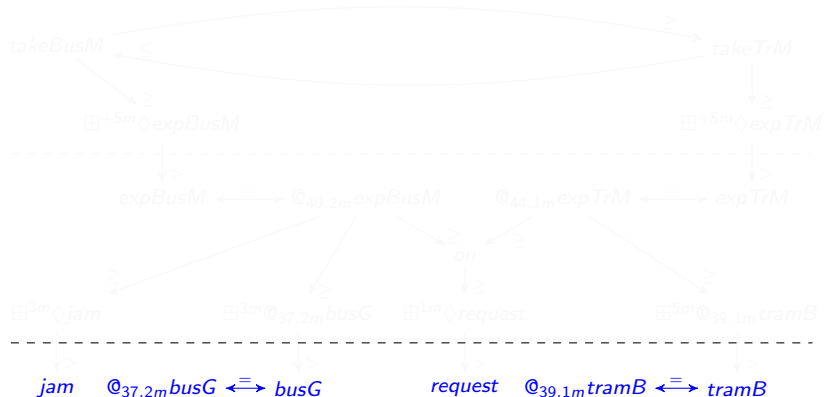
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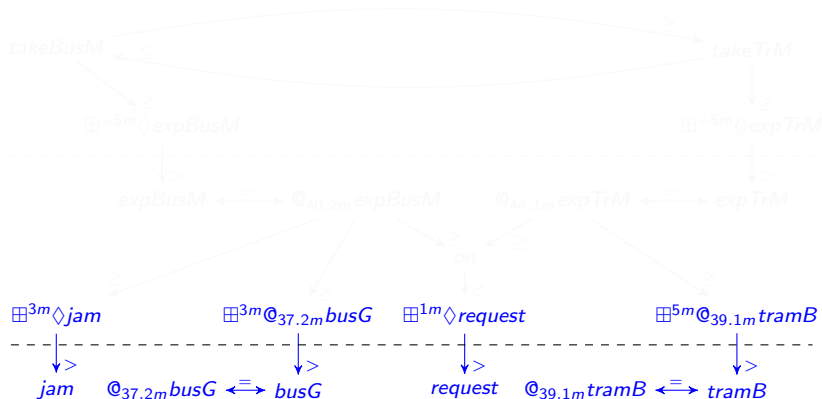
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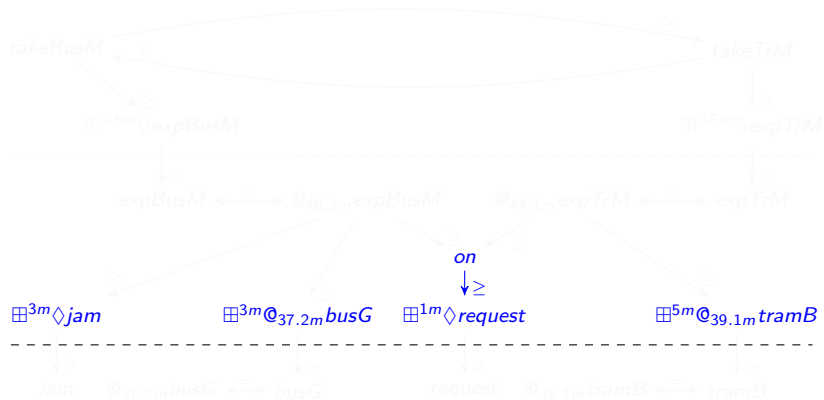
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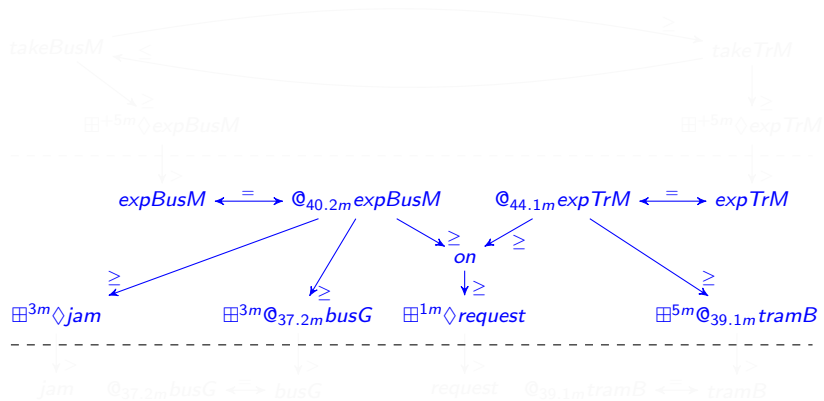
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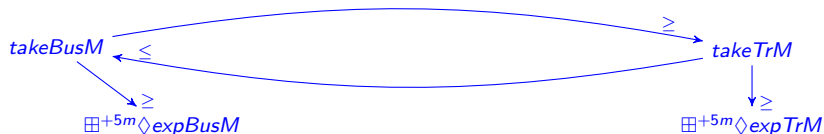
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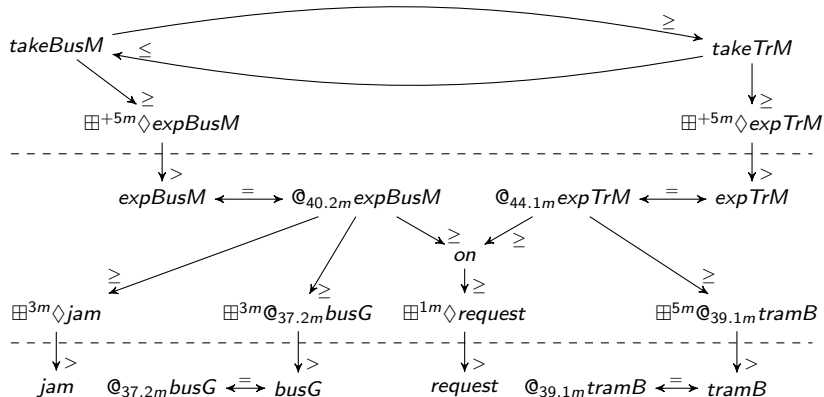
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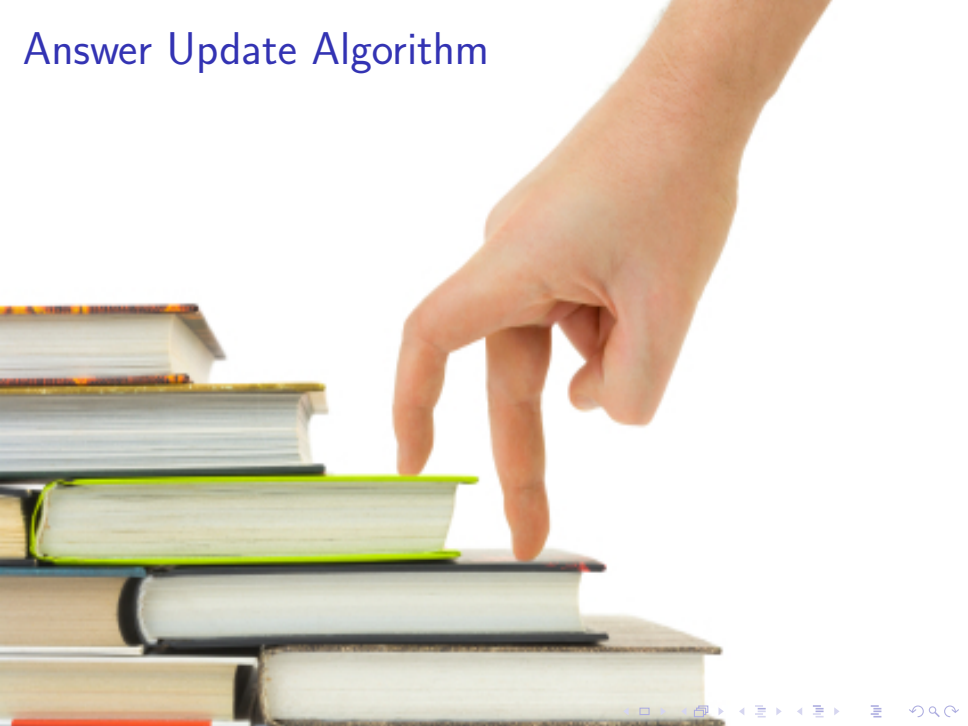
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Answer Update Algorithm



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Goal: given an answer stream I' at $t' < t$ and the input change from t' to t , compute I at t !

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Idea: “Truth Maintenance Systems” + Temporal Aspect

- ▶ $I \Leftrightarrow$ TMS-like structure \mathcal{M}
- ▶ Label: (*in/out/unknown*, $\{[t_1, t_2], \dots, [t_{n-1}, t_n]\}$)

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Algorithm AnswerUpdate(t, D, \mathcal{M})

- ▶ Update time labels of atoms with unchanged status
- ▶ Only re-evaluate the status of atoms affected by change in the input

Answer Update Algorithm: Main Building Blocks

Initialization

- ▶ all labels($out, [0, 0]$) $\Rightarrow \mathcal{M}$
- ▶ call AnswerUpdate(0, empty stream, \mathcal{M})

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Expire/Fire Input

- ▶ *Expired*(ℓ, t', t)
- ▶ *Fired*(ℓ, t', t)

\Rightarrow Collect affected window atoms

Answer Update Algorithm: Main Building Blocks

Time adjustment

- ▶ Body window atoms with unchanged status and updated time labels \Rightarrow update head's time labels

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Status adjustment

- ▶ Set *unknown* atoms
- ▶ Founded (in)valid rules \Rightarrow set head's status
- ▶ Unfounded (in)valid rules \Rightarrow assign head & *unknown* body's status

Answer Update Algorithm: Main Building Blocks

Time adjustment

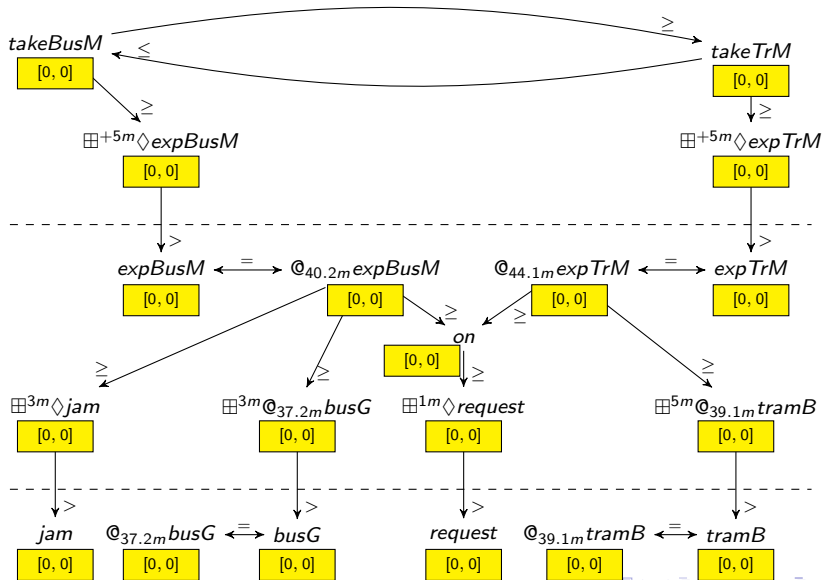
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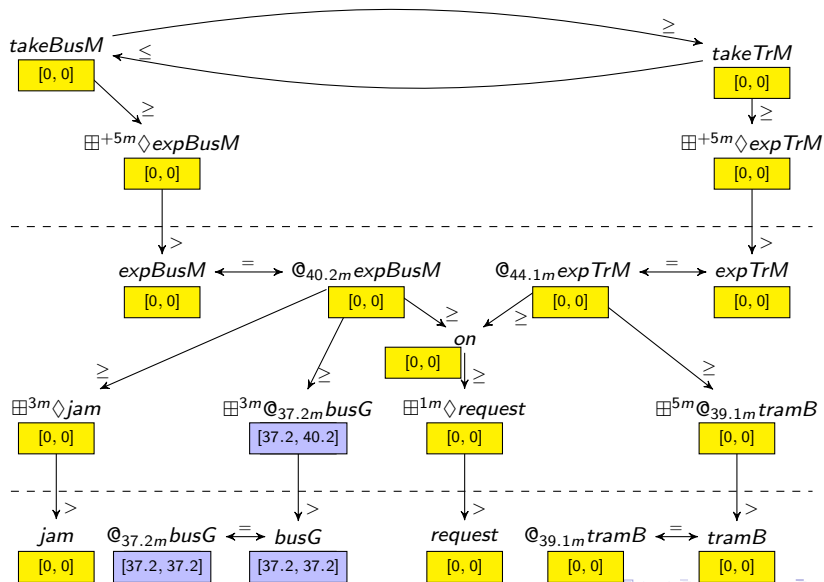
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Loop through strata

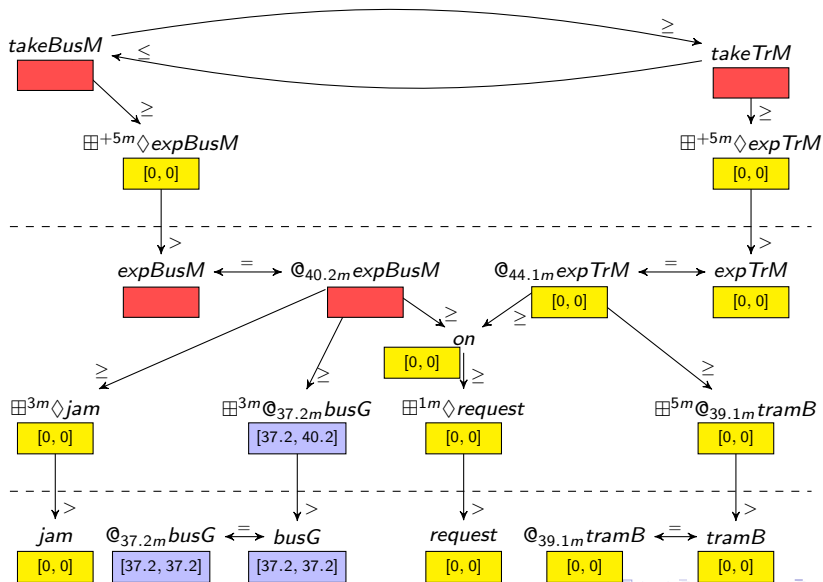
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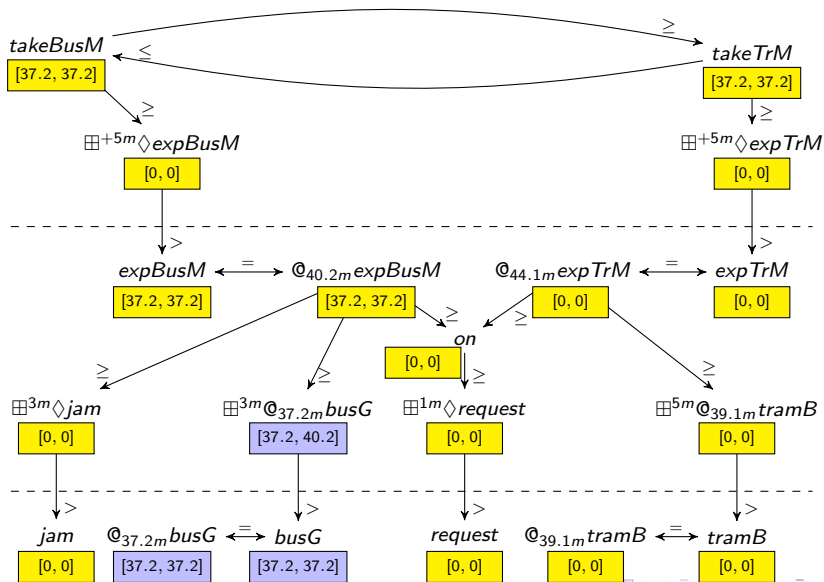
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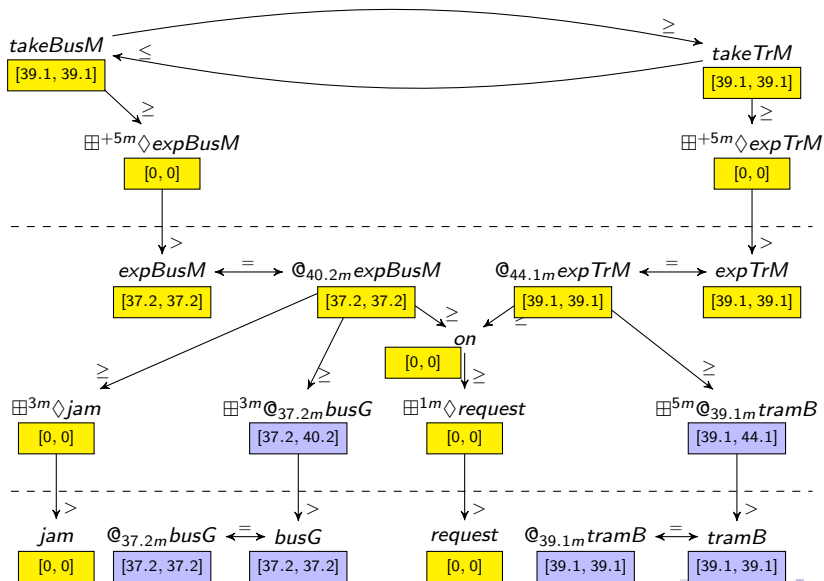
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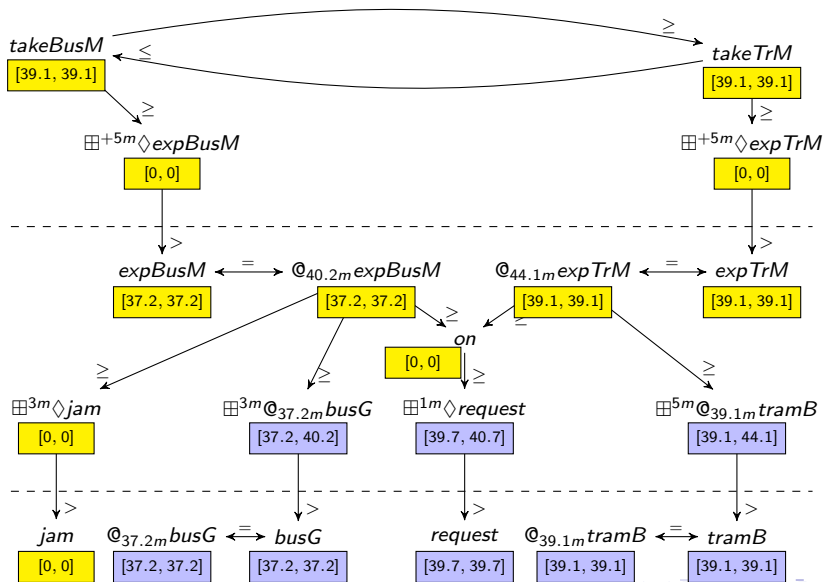
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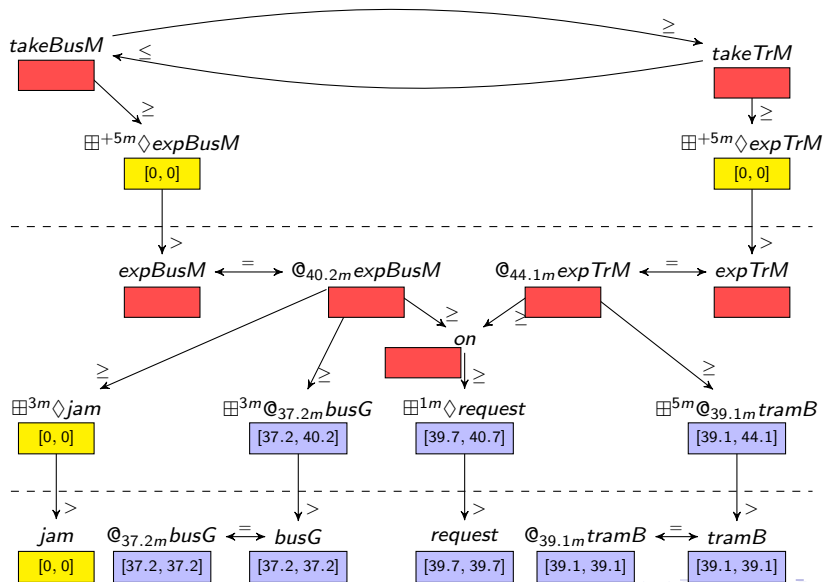
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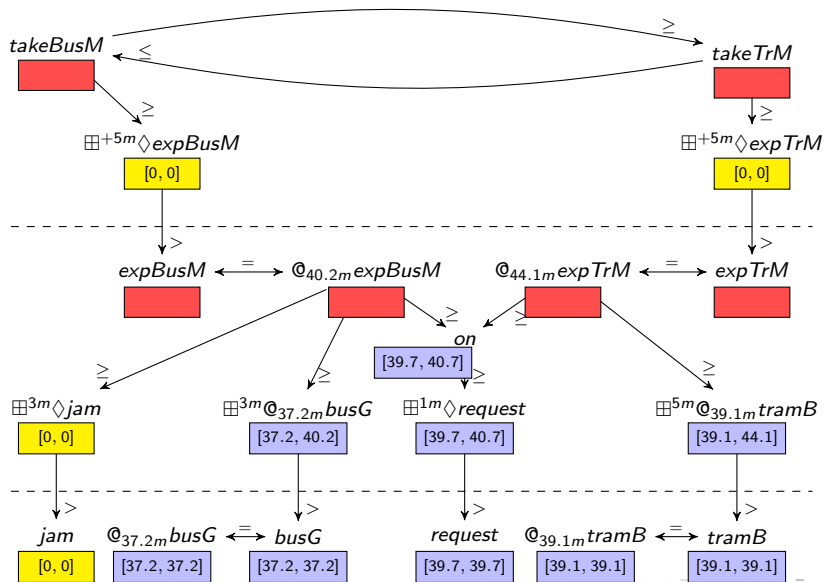
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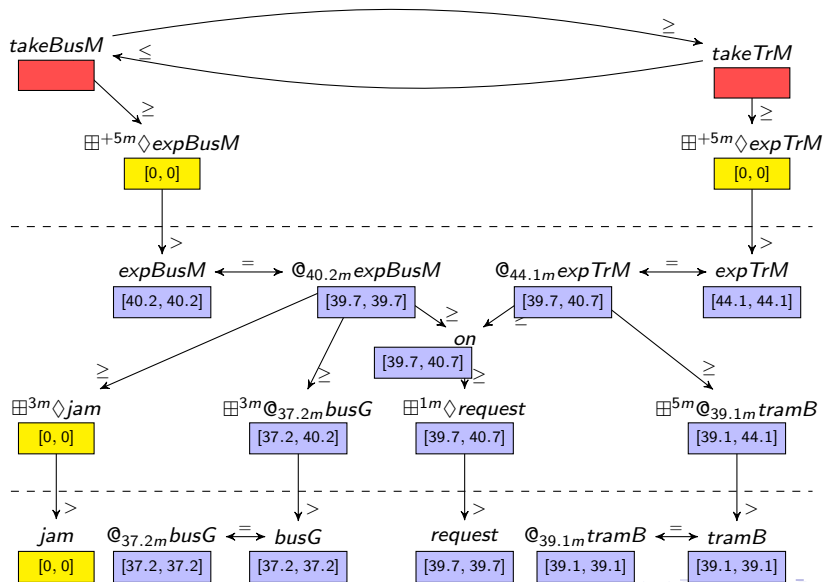
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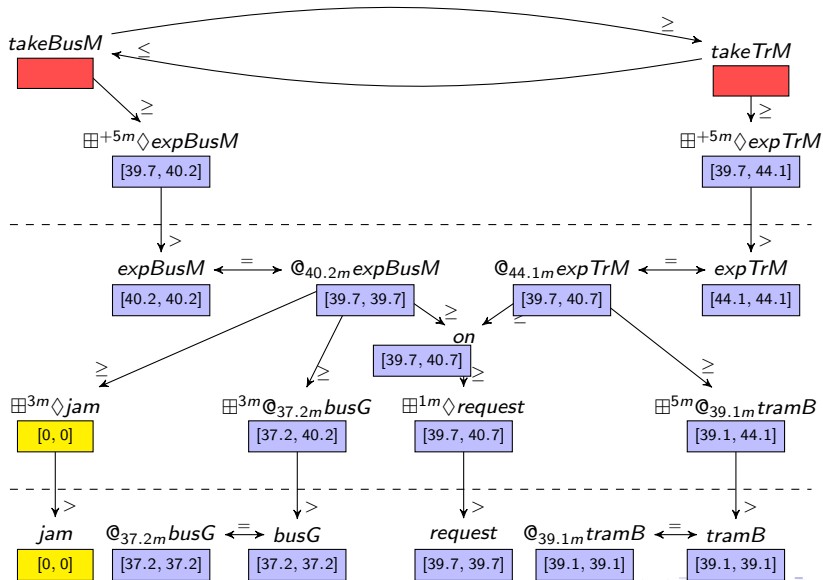
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Ongoing Implementation

- ▶ Simple evaluation for general LARS formulas
- ▶ Stream stratification recognition
- ▶ Initial comparison between generic evaluation and stratified evaluation
- ▶ More to come . . .

Conclusions

