



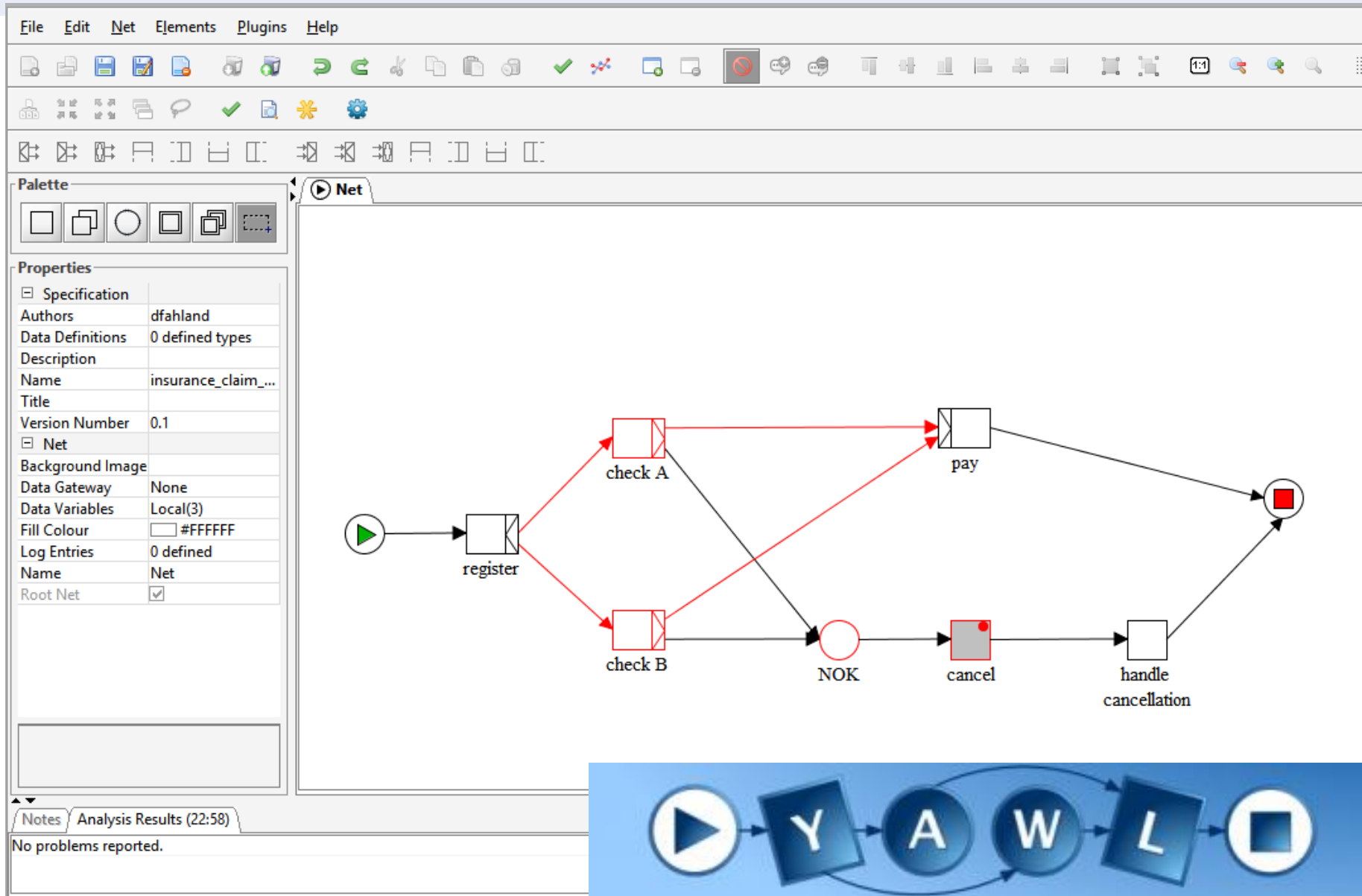
Dr. Dirk **Fahland**

d.fahland@tue.nl / @dfahland

Describing, Discovering, and Understanding Multi-Dimensional Processes

TU/e
EINDHOVEN
UNIVERSITY OF
TECHNOLOGY

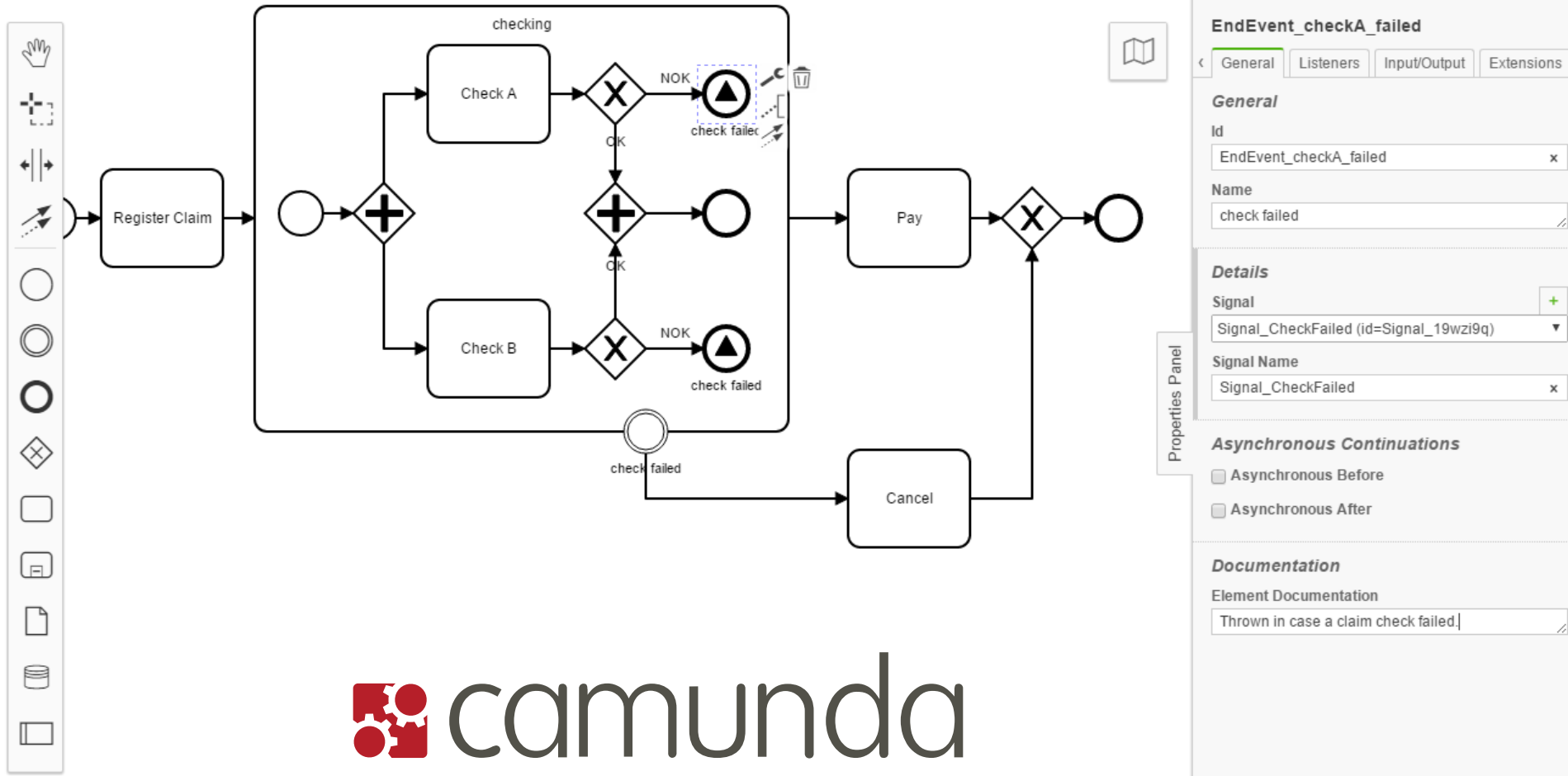
Processes and Petri Nets



Locality of transitions
+ places:

- Perfect fit for process modeling, execution, analysis

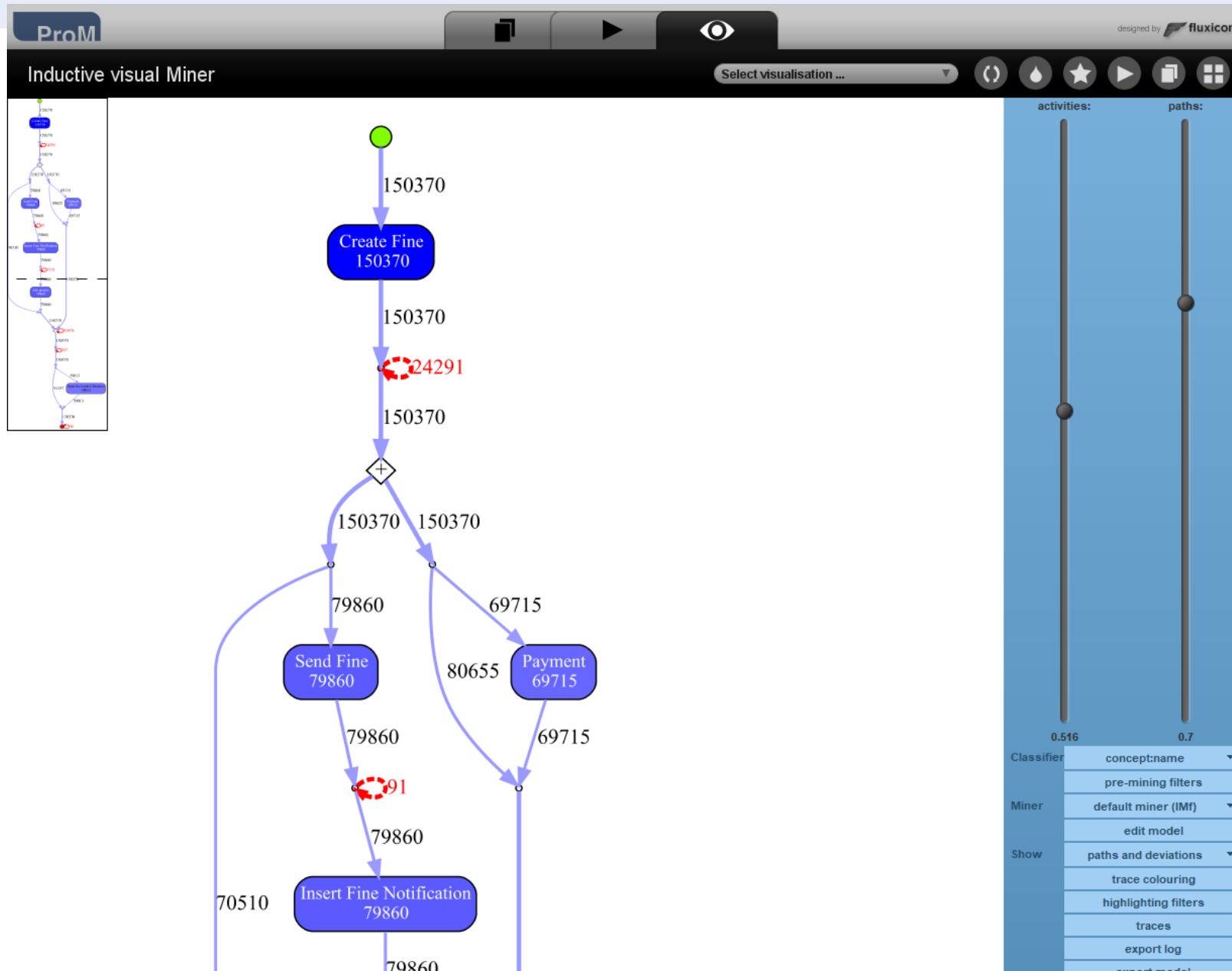
Processes and Petri Nets



Locality of transitions
+ places:

- Perfect fit for process modeling, execution, analysis
- Heavily influenced design of industrial modeling languages, execution engines

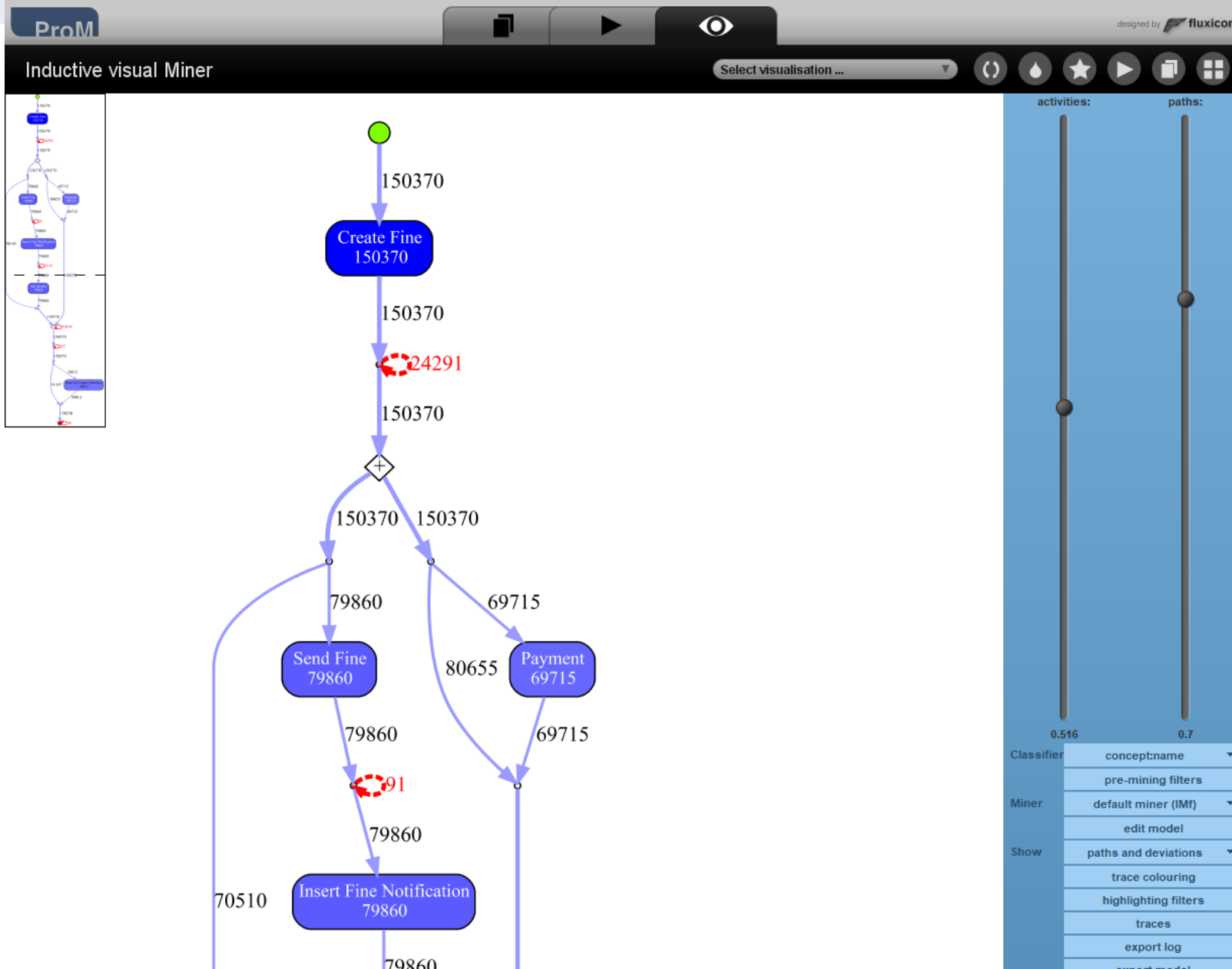
Processes and Petri Nets



Locality of transitions + places:

- Perfect fit for process modeling, execution, analysis
- Heavily influenced design of industrial process modeling languages, process execution engines
- Foundational to process mining

Processes and Petri Nets

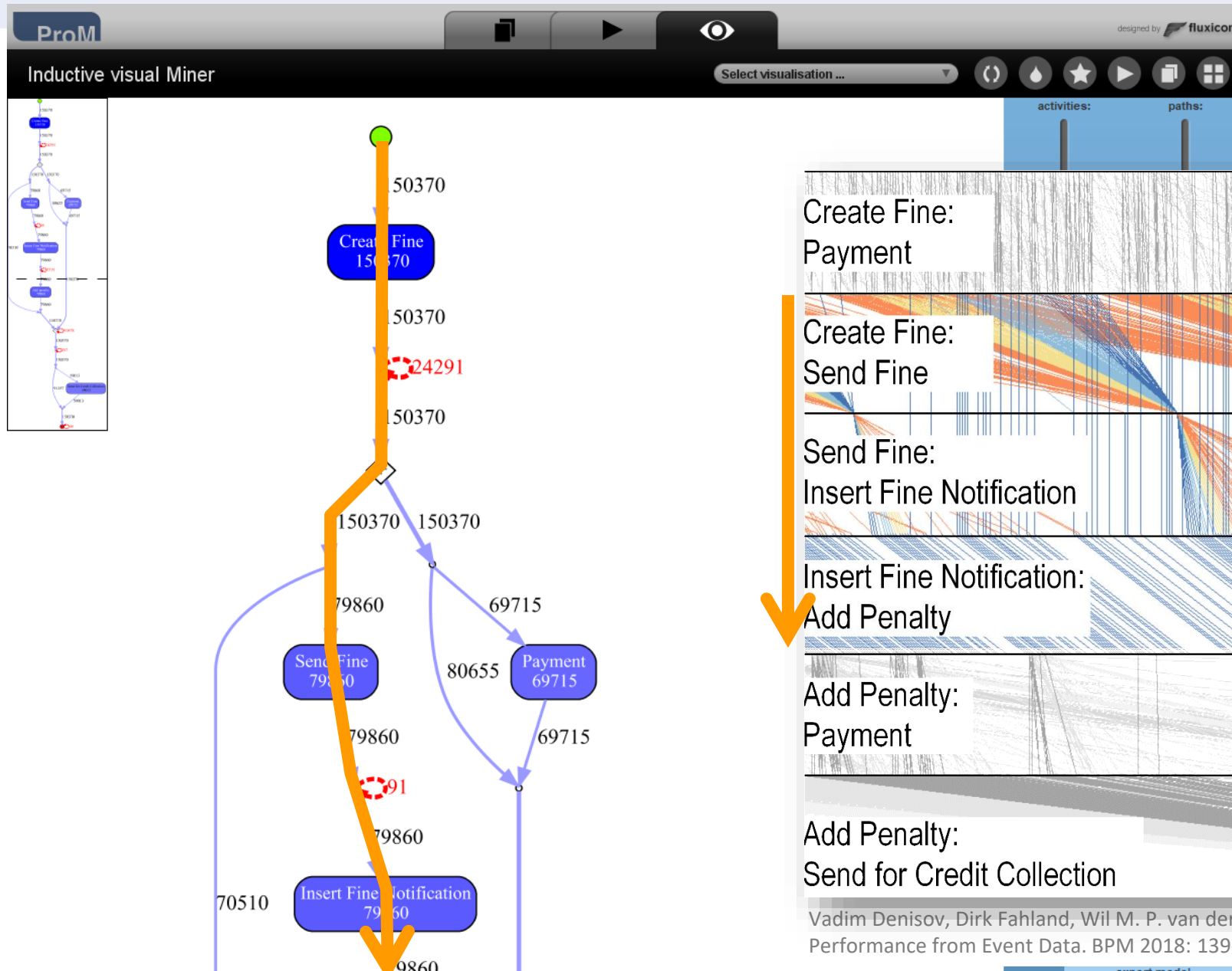


Locality of transitions
+ places:

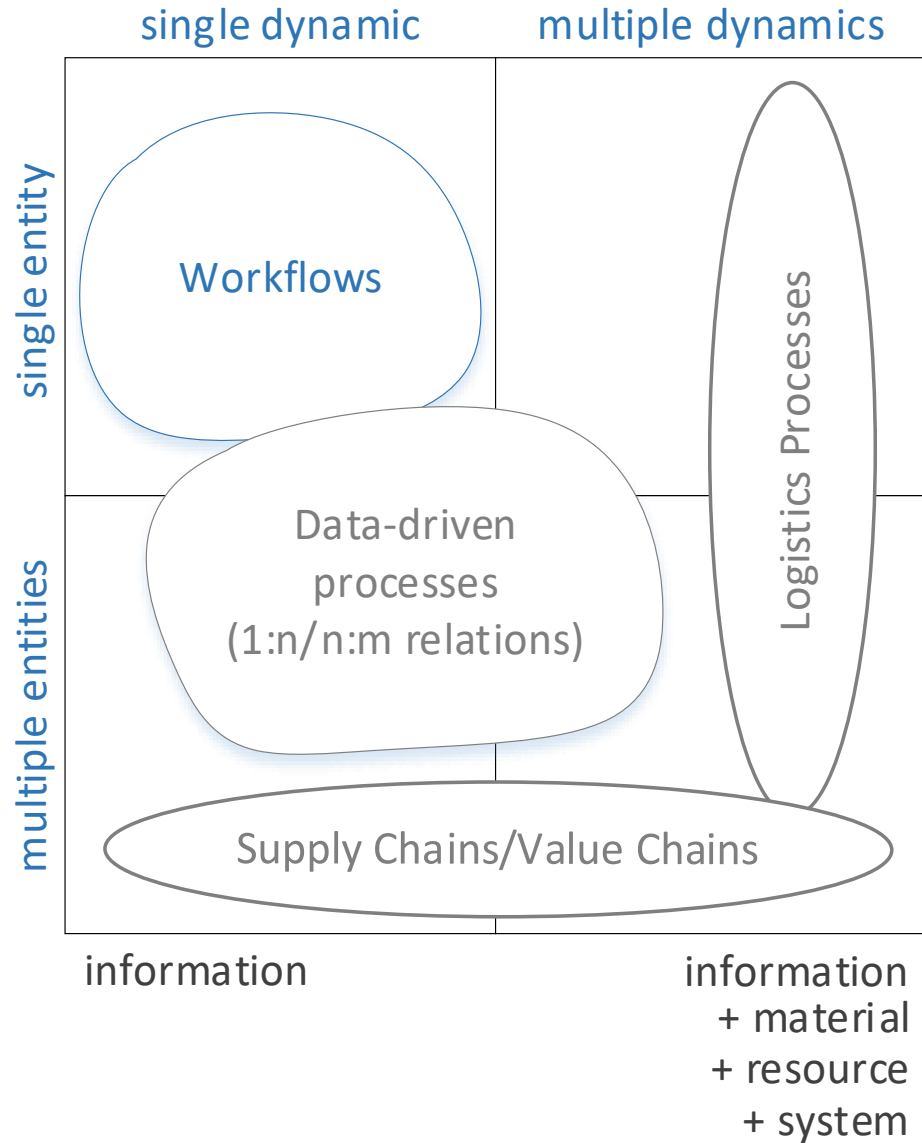
- Perfect fit for process modeling, execution, analysis
- Heavily influenced design of industrial process modeling languages, process execution engines
- Foundational to process mining

Assumption: one run = one process instance in isolation

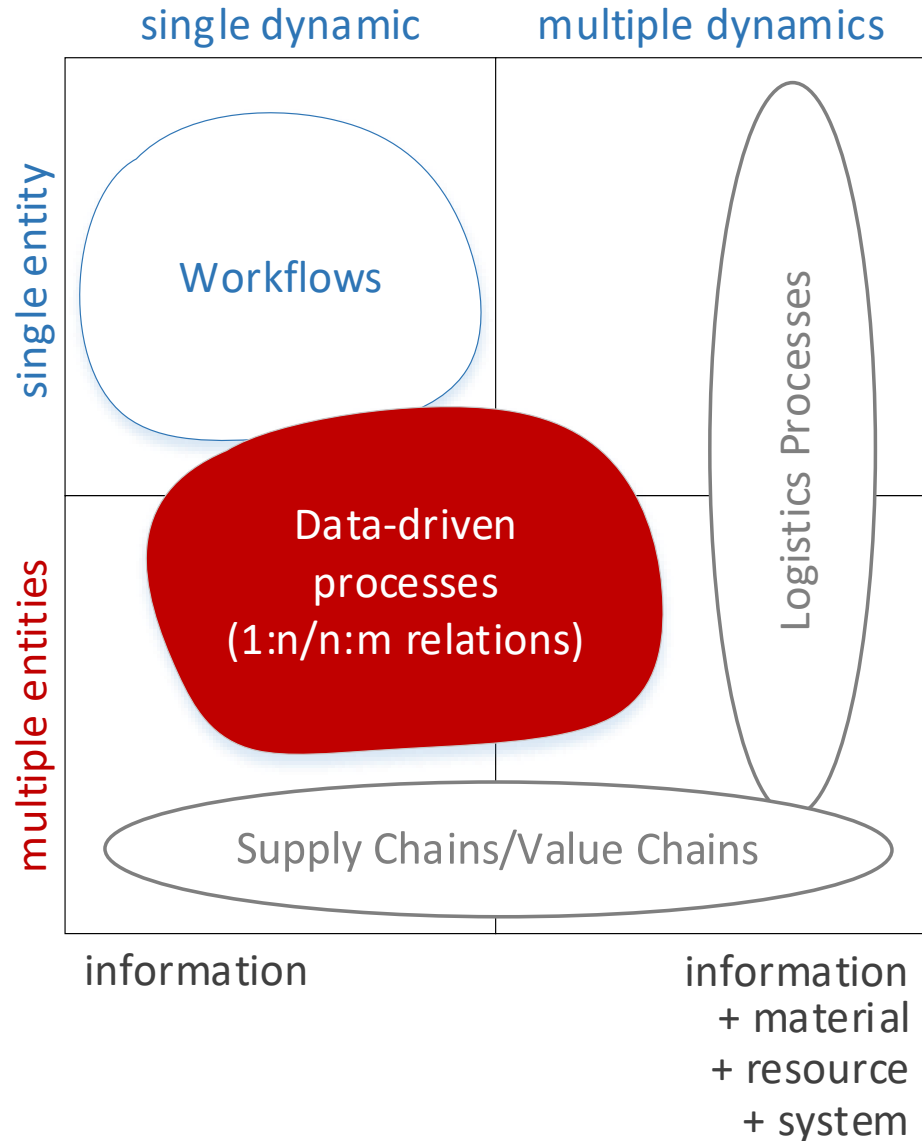
Process instances are NEVER isolated



Dimensions in Processes



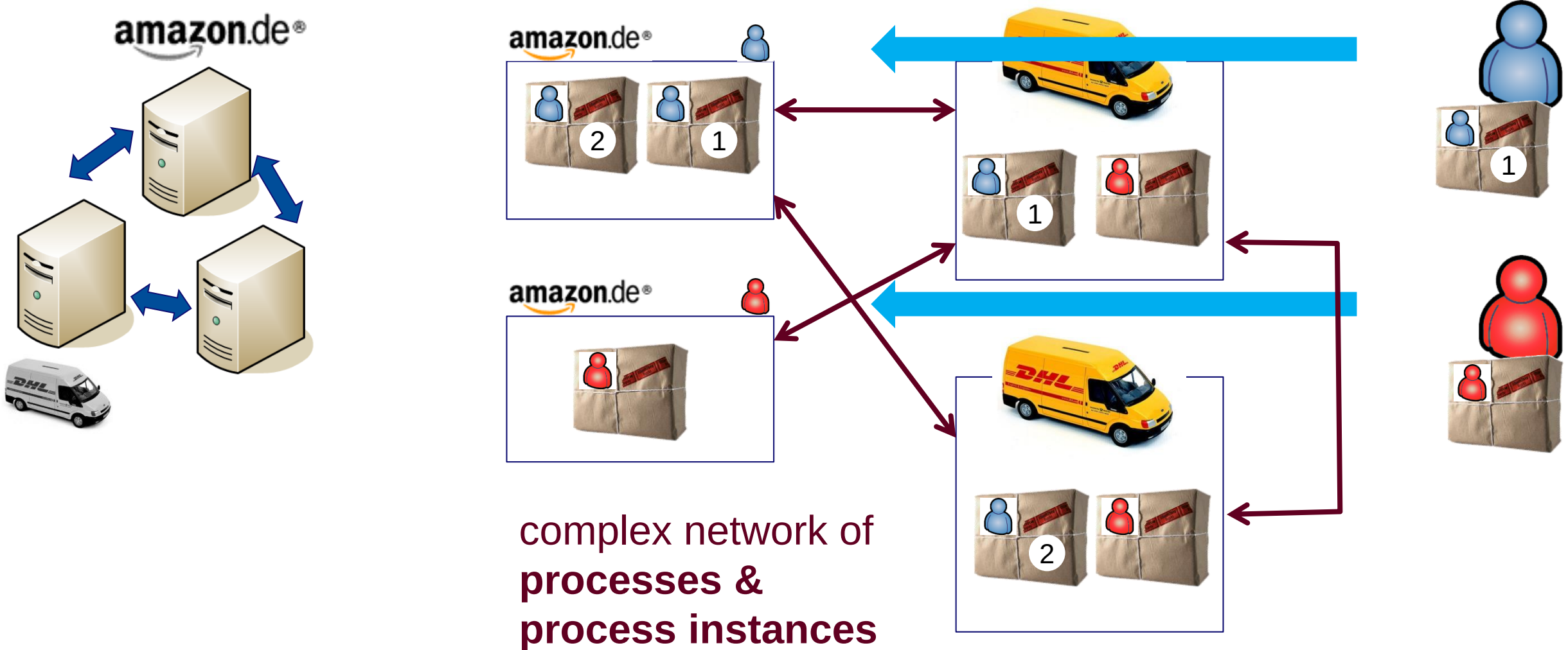
Multi-Dimensional Processes



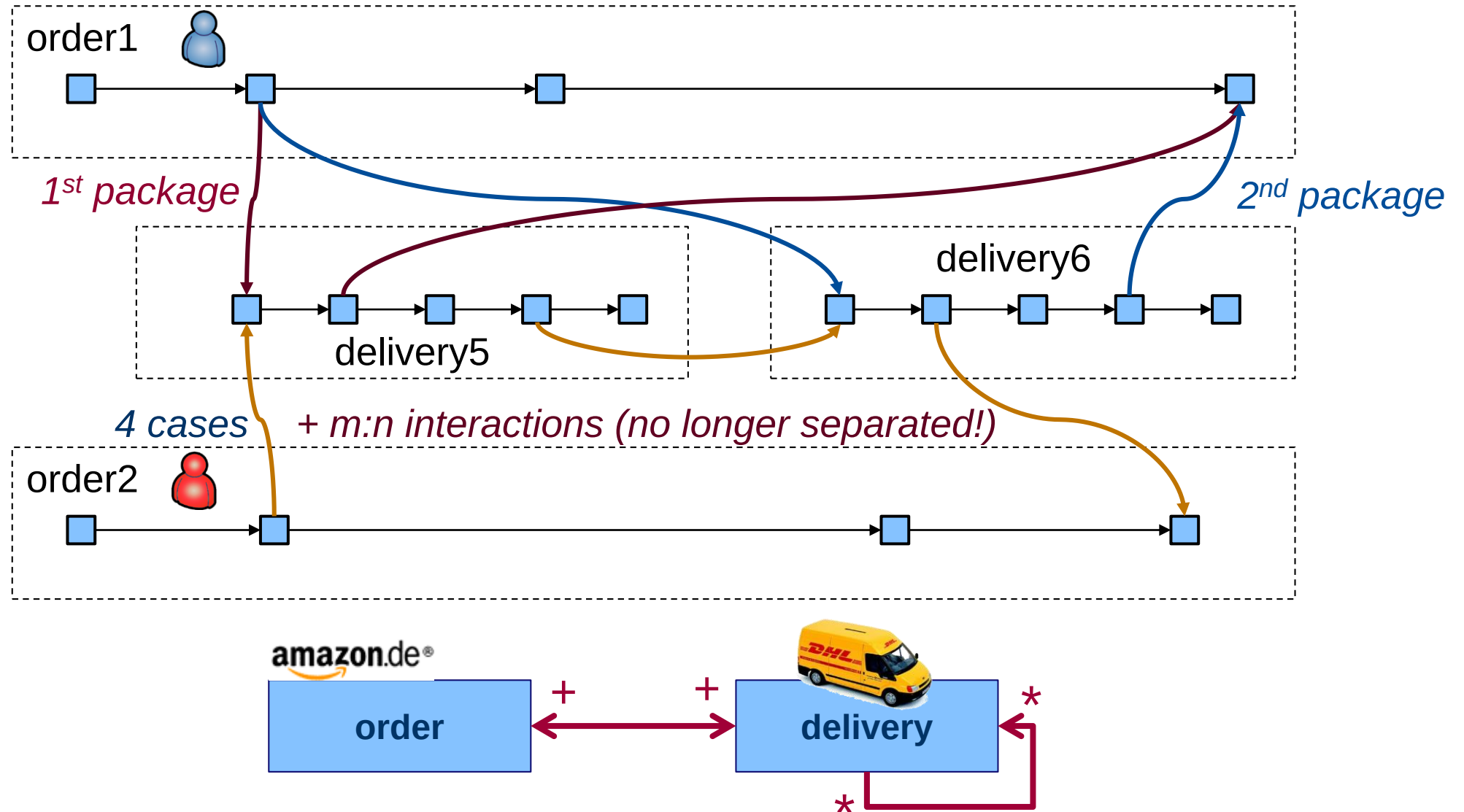
■ Processes with multiple entities

- How do they look like in practice?
- Where does current modeling fail?
 - Implementation
 - Process mining
- A proposal
- New research questions

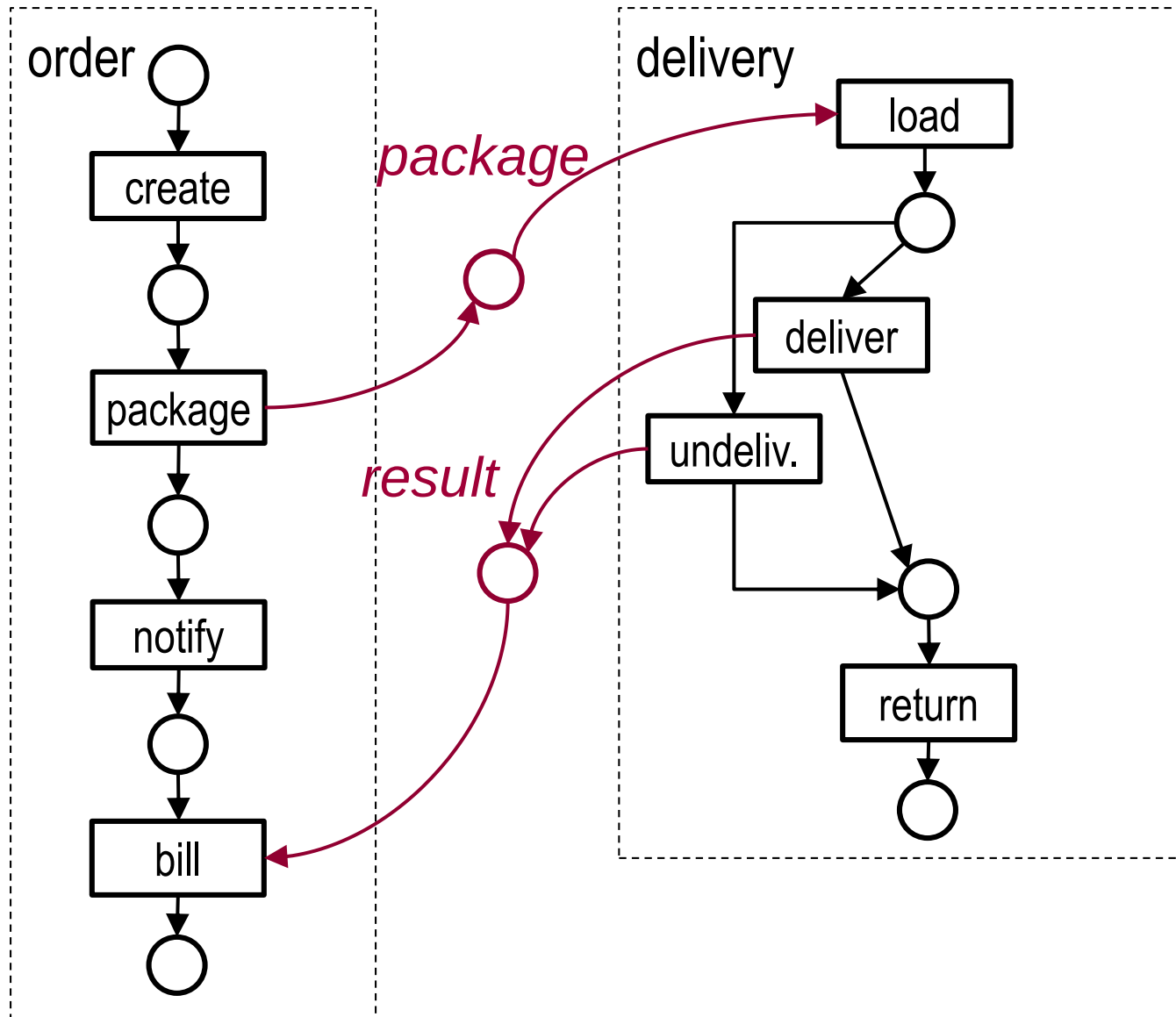
Multi-Dimensional Dynamics



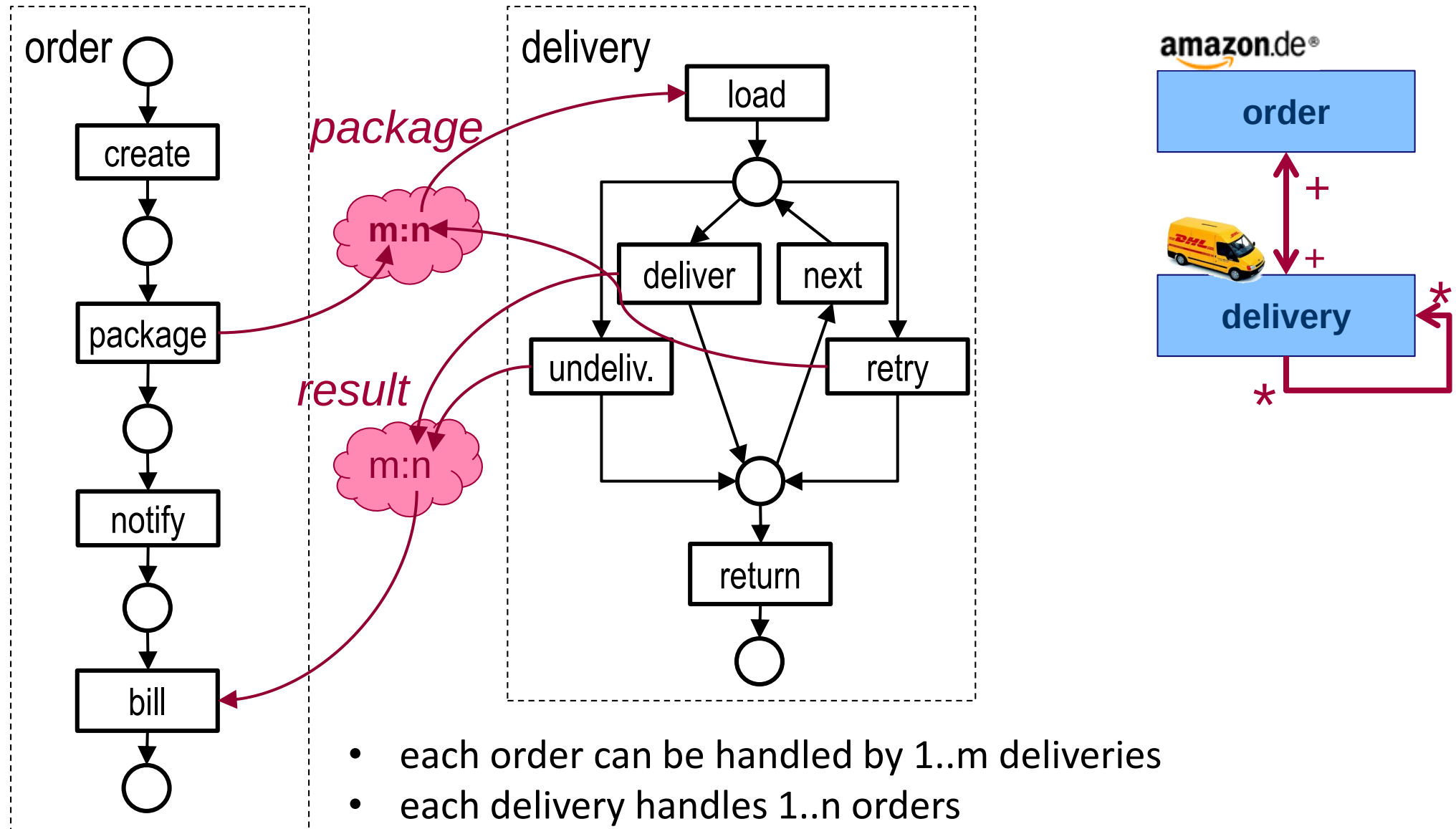
Interacting Cases - M:N



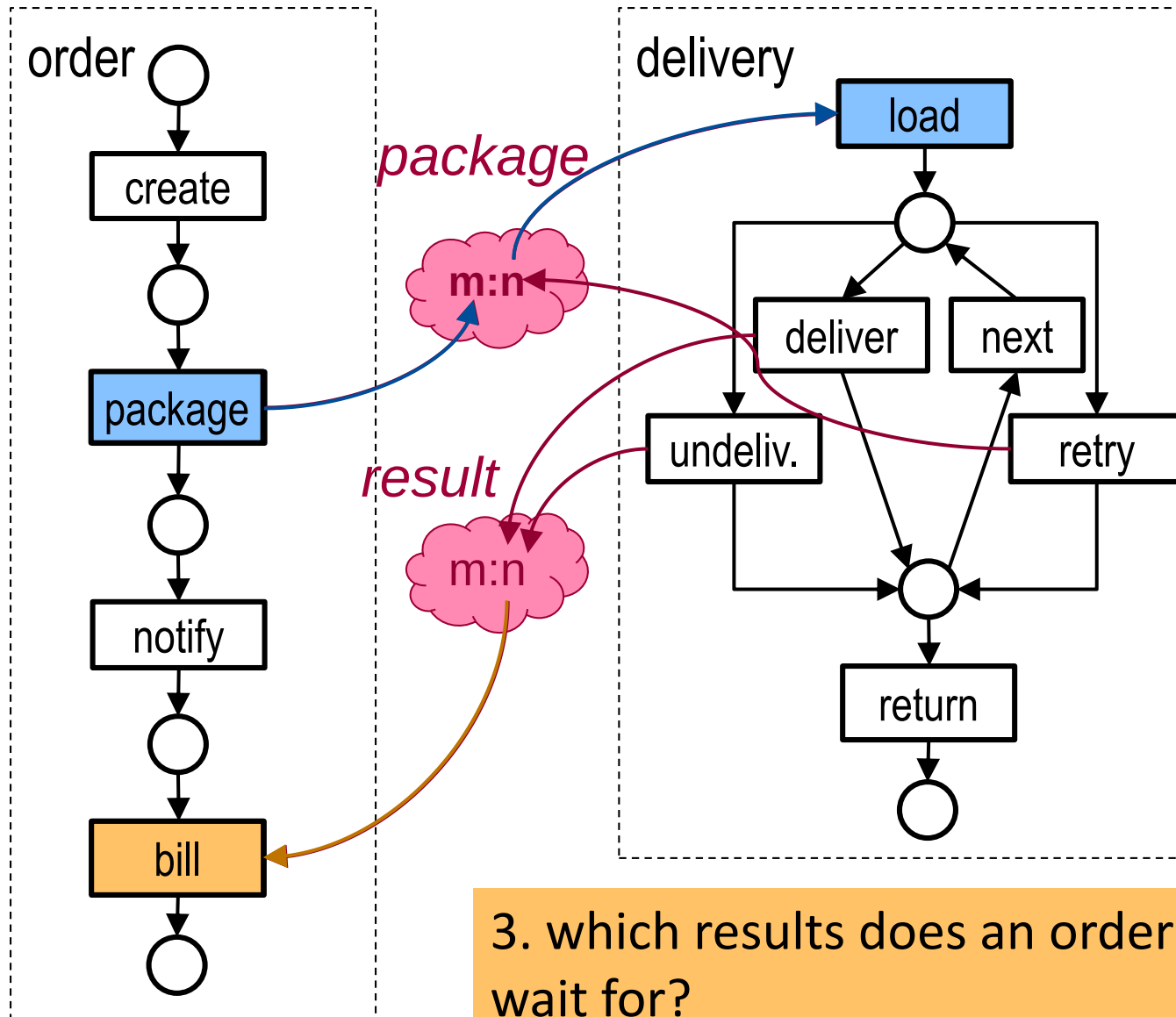
Modeling 1:1 Interactions



Modeling M:N Interactions?



What is missing to have an executable model?

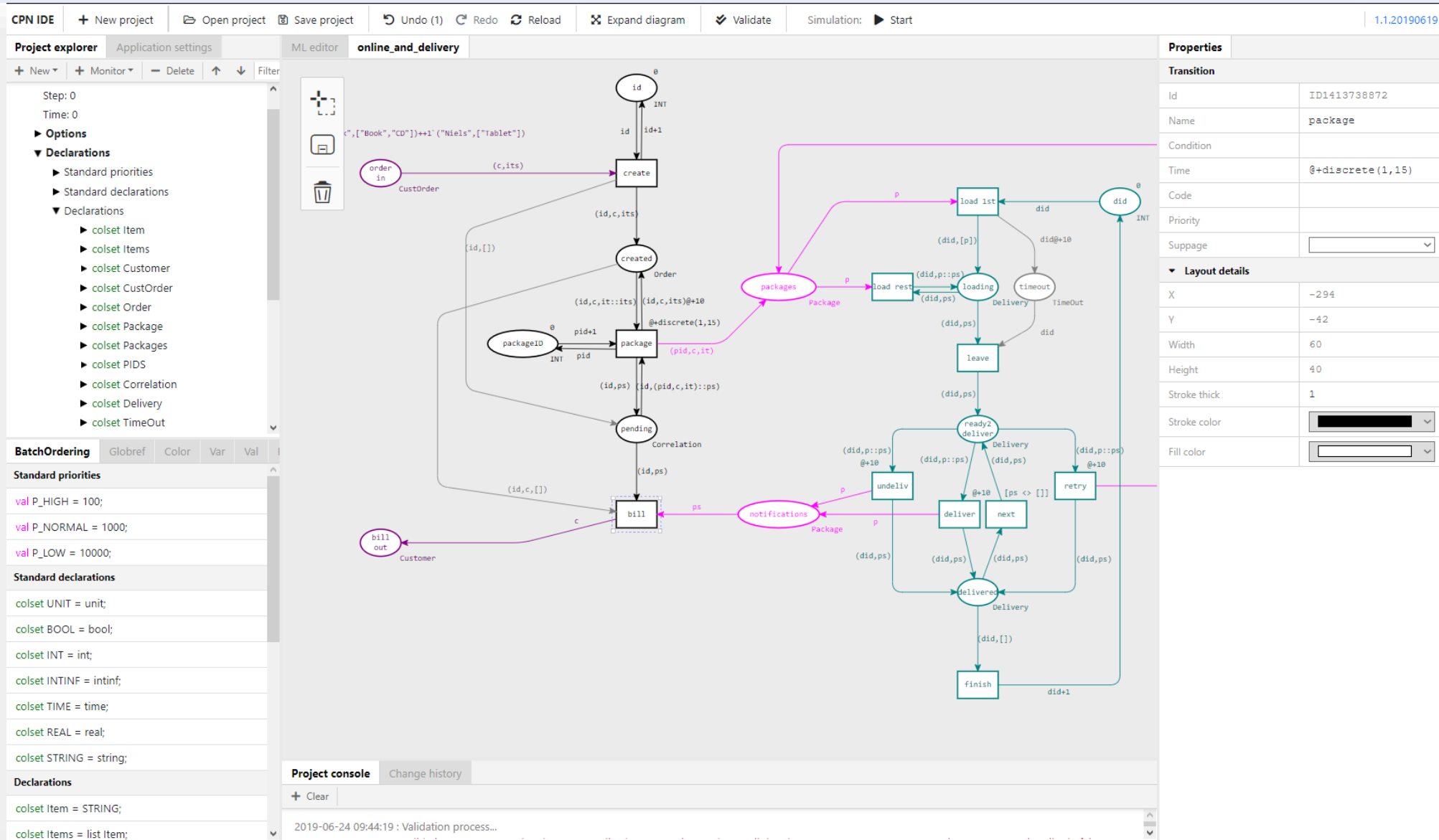


1. distinguish different packages

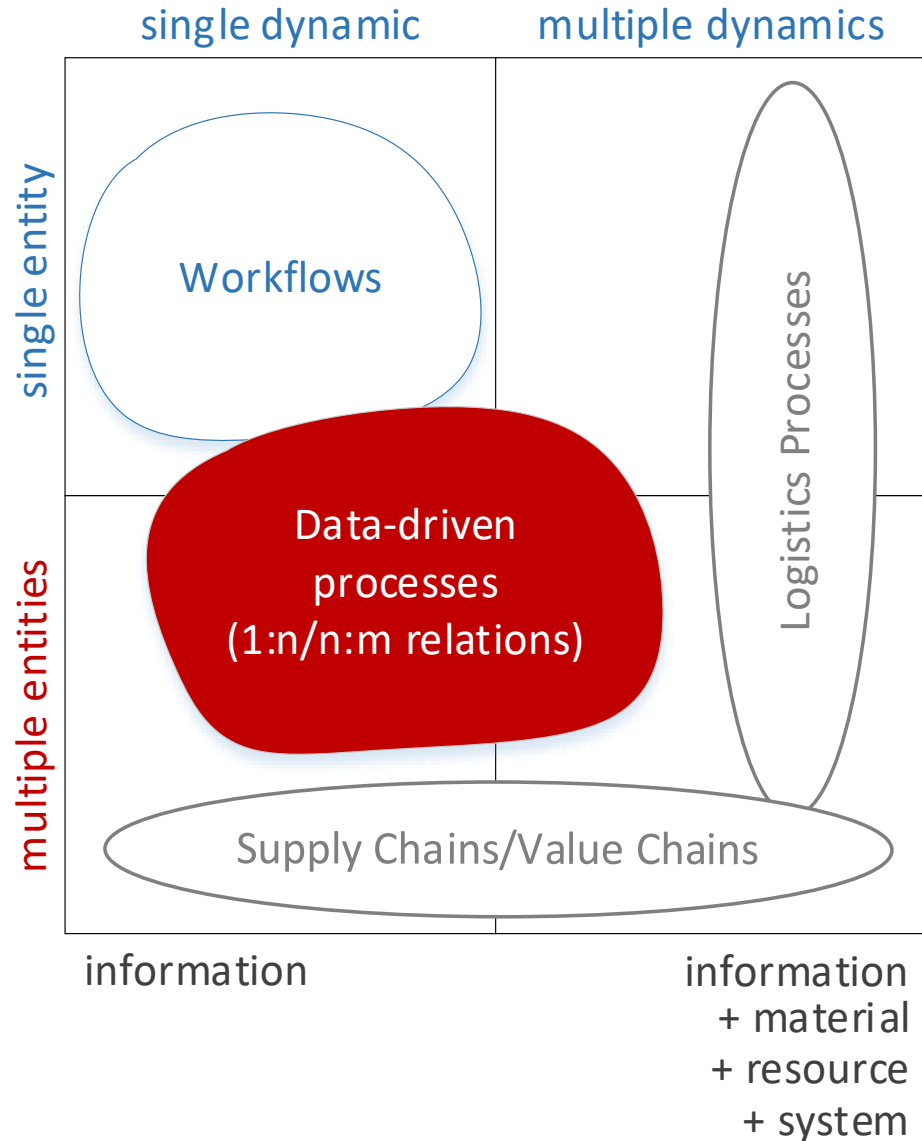
2. how many packages and to which delivery does a package go?

3. which results does an order consume/ wait for?

Can be modeled with Coloured Petri Nets

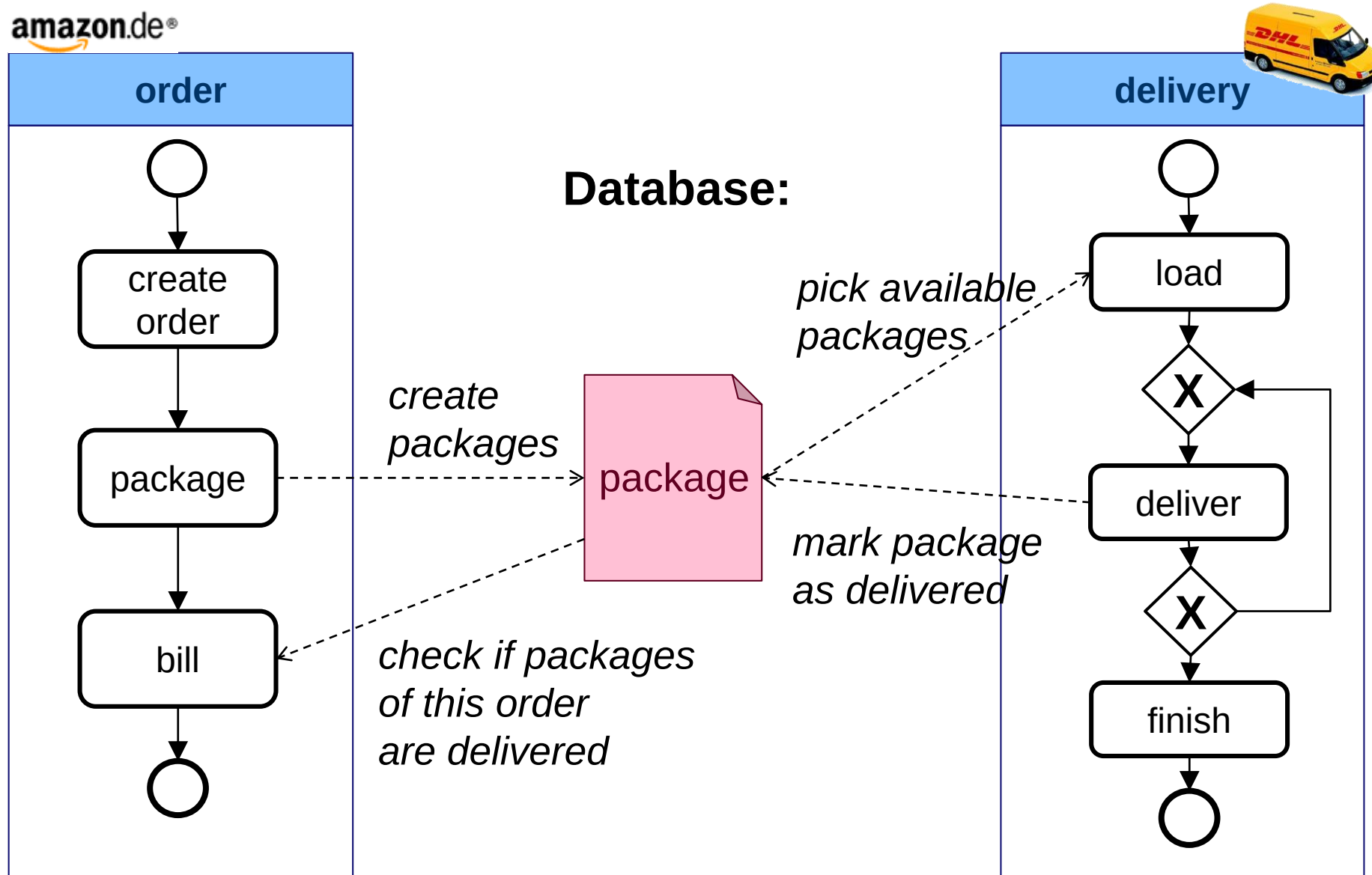


Multi-Dimensional Processes



- **Processes with multiple entities**
 - How do they look like in practice?
 - **Where does current modeling fail?**
 - **Implementation**
 - Process mining
 - A proposal
 - New research questions

Implementation: BPMN + Relational Data + Operations



BPMN + Relational Data + Operations

create packages

amazon.de®

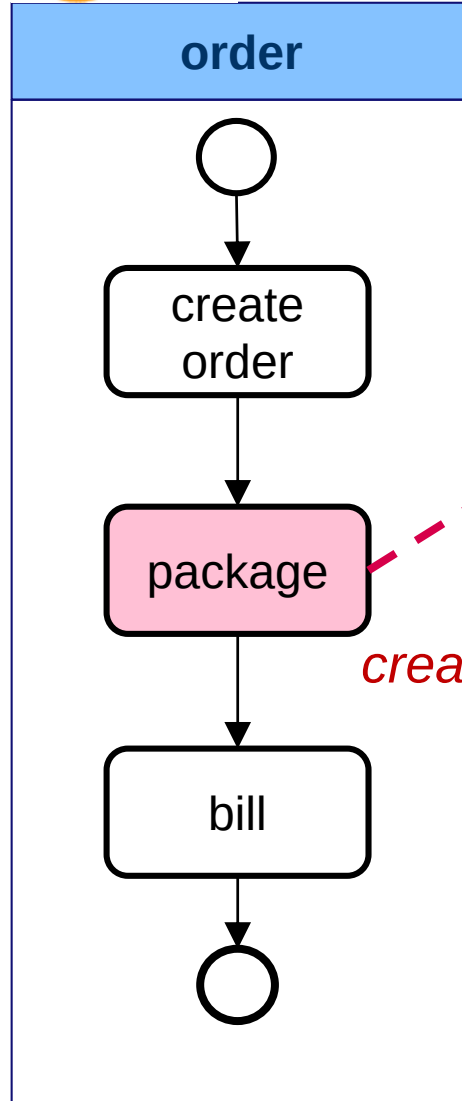
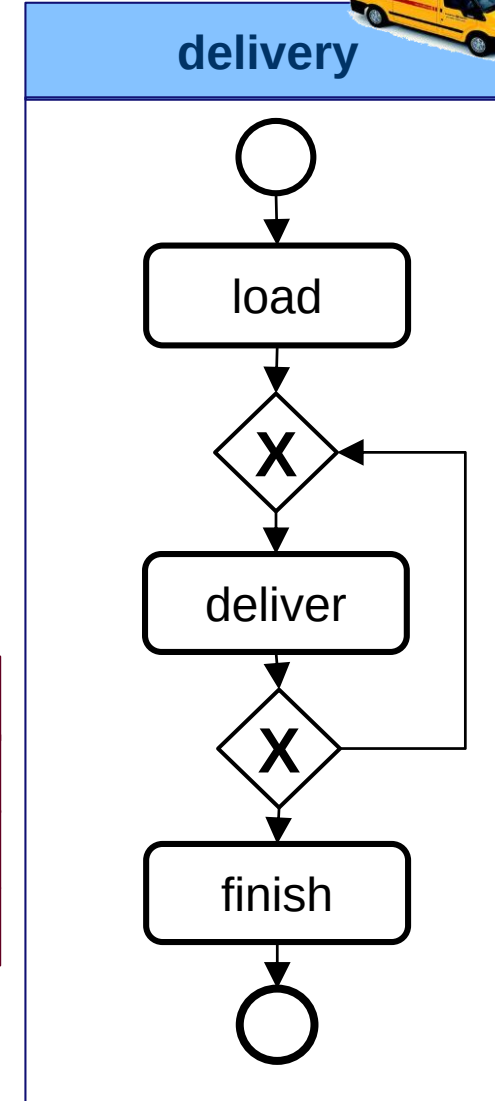


table package

pID	orderID	customer	...
21	1	Mr. Red	...
22	2	Mrs. Blue	...
25	1	Mr. Red	...

create

...	state
...	ready
...	ready
...	waiting



BPMN + Relational Data + Operations

... attributes referring to process instances

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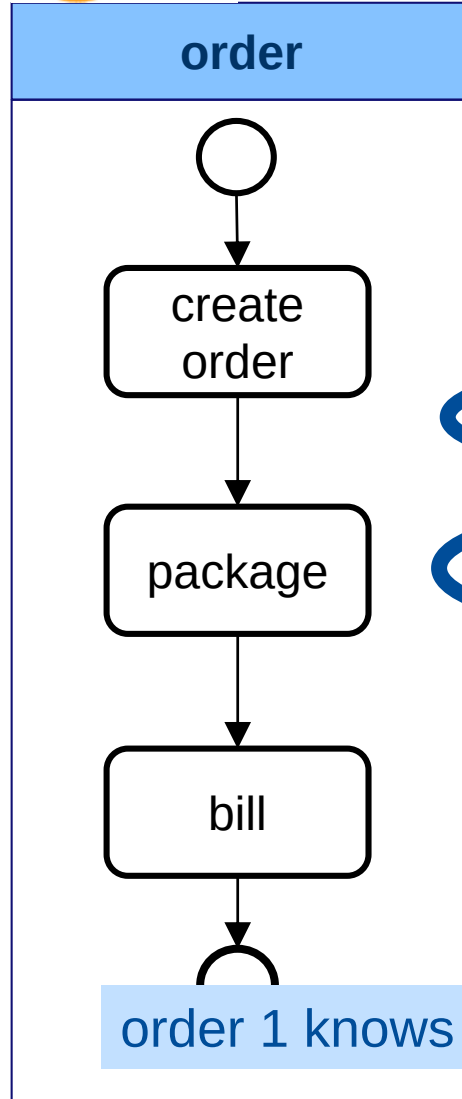
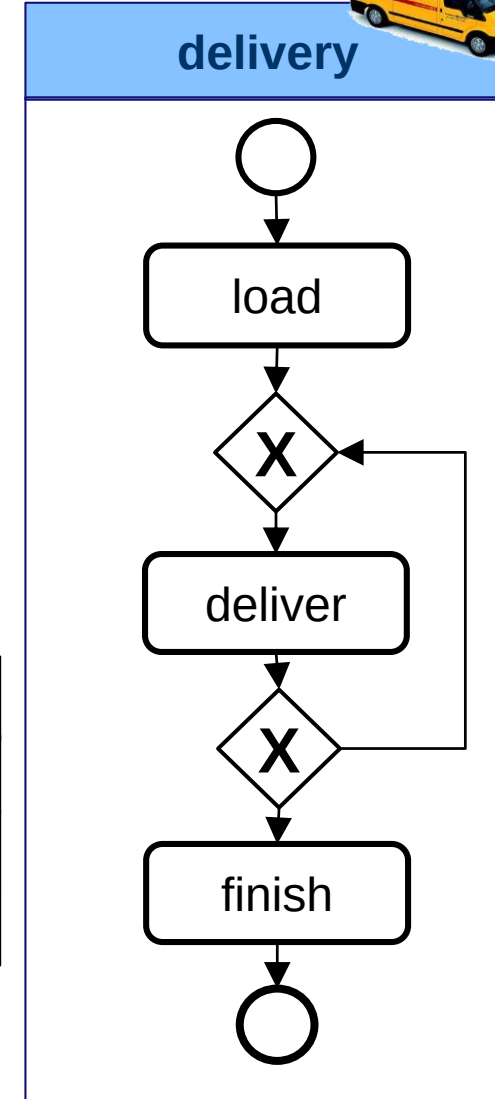


table package

pID	orderID	customer	...
21	1	Mr. Red	...
22	2	Mrs. Blue	...
25	1	Mr. Red	...

...	state
...	ready
...	ready
...	waiting

order 1 knows packages {21,25}



BPMN + Relational Data + Operations

associate ready packages to "delivery 5"

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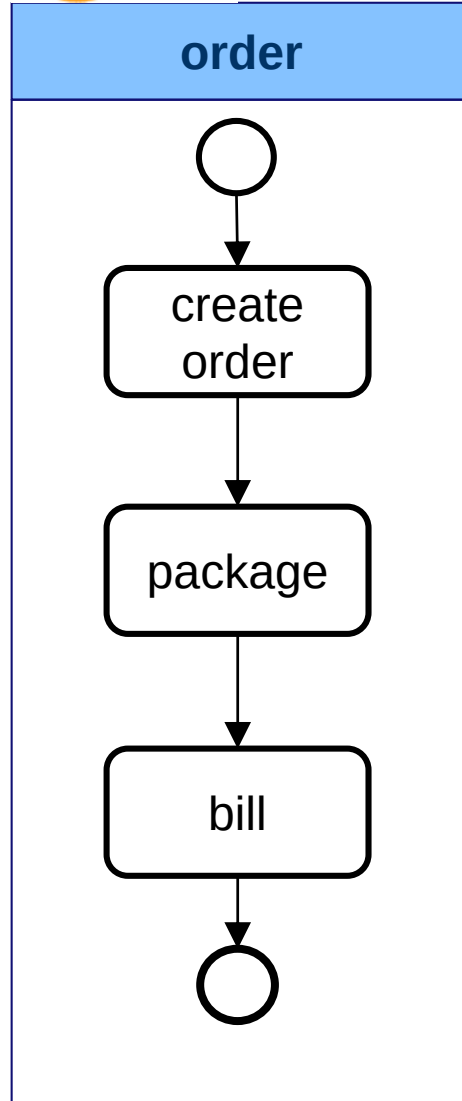
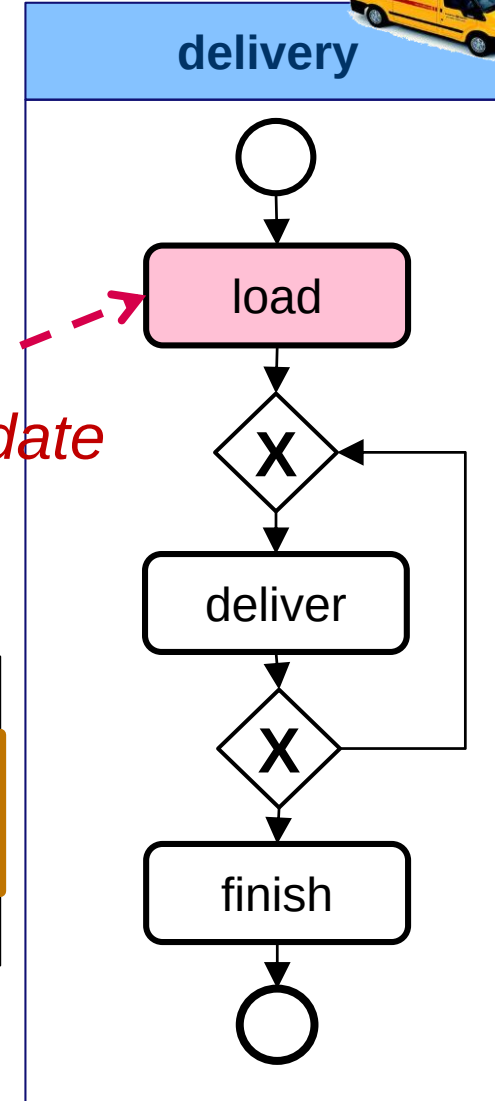


table package

pID	orderID	customer	...
21	1	Mr. Red	...
22	2	Mrs. Blue	...
25	1	Mr. Red	...

update

...	delivID	state
...	null	ready
...	null	ready
...	null	waiting



BPMN + Relational Data + Operations

associate ready packages to "delivery 5"

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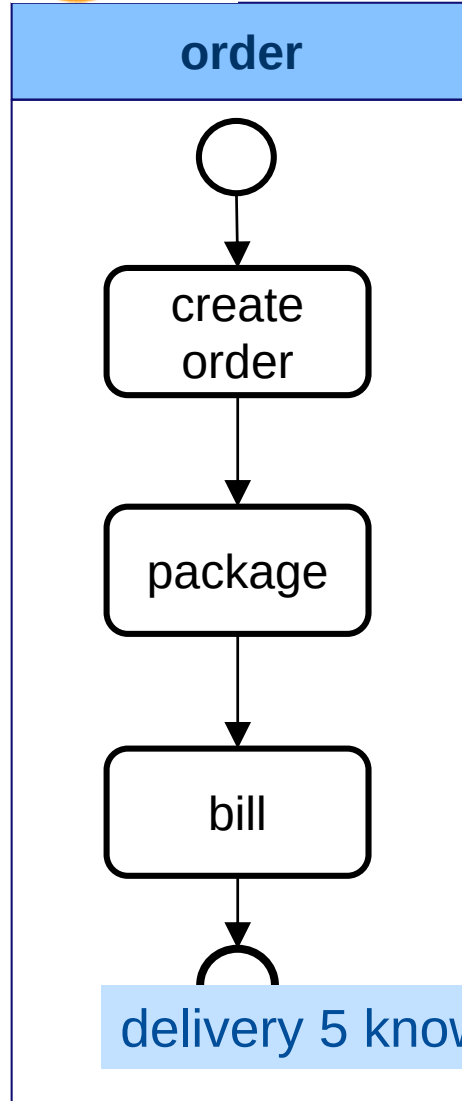


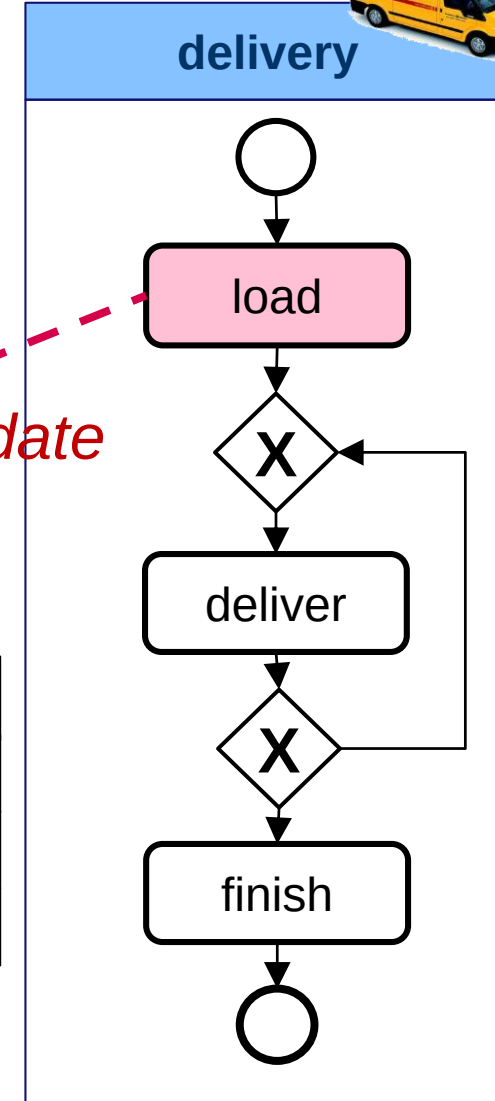
table package

pID	orderID	customer	...
21	1	Mr. Red	...
22	2	Mrs. Blue	...
25	1	Mr. Red	...

...	delivID	state
..	5	loaded
..	5	loaded
...	null	waiting

update

delivery 5 knows packages {21,22}



BPMN + Relational Data + Operations

complex sync: bill only when all delivered

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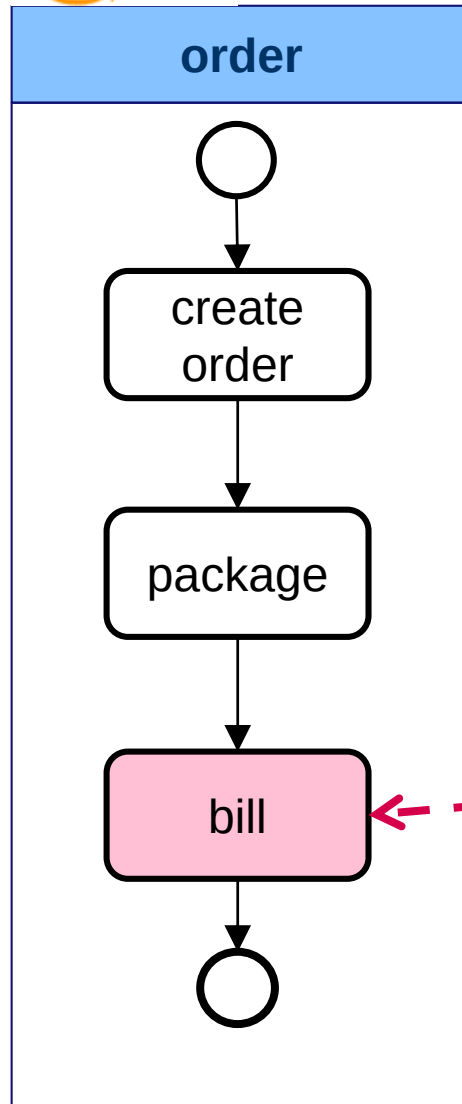


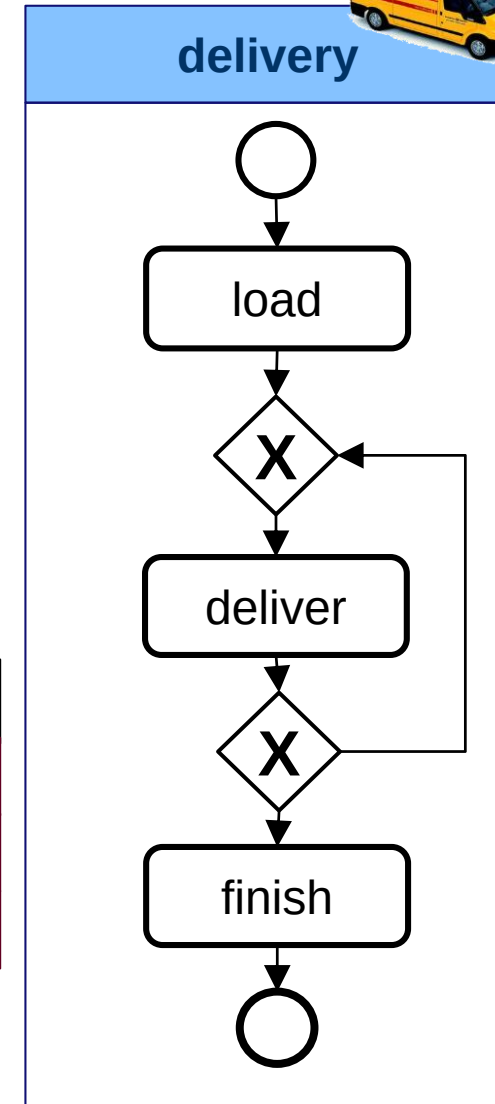
table package

pID	orderID	customer	...
21	1	Mr. Red	...
22	2	Mrs. Blue	...
25	1	Mr. Red	...

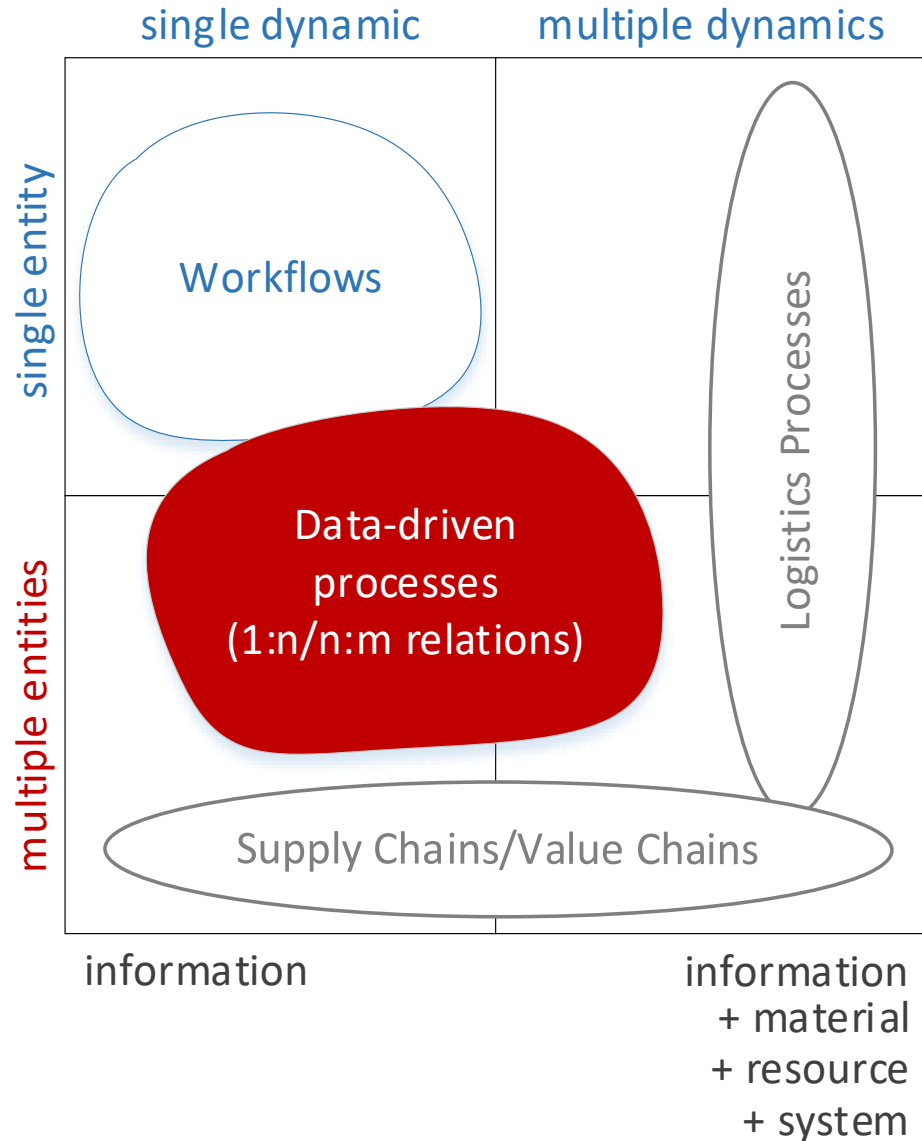
...	delivID	state
...	null	deliv.
...	null	deliv.
...	null	ready

read

delivery



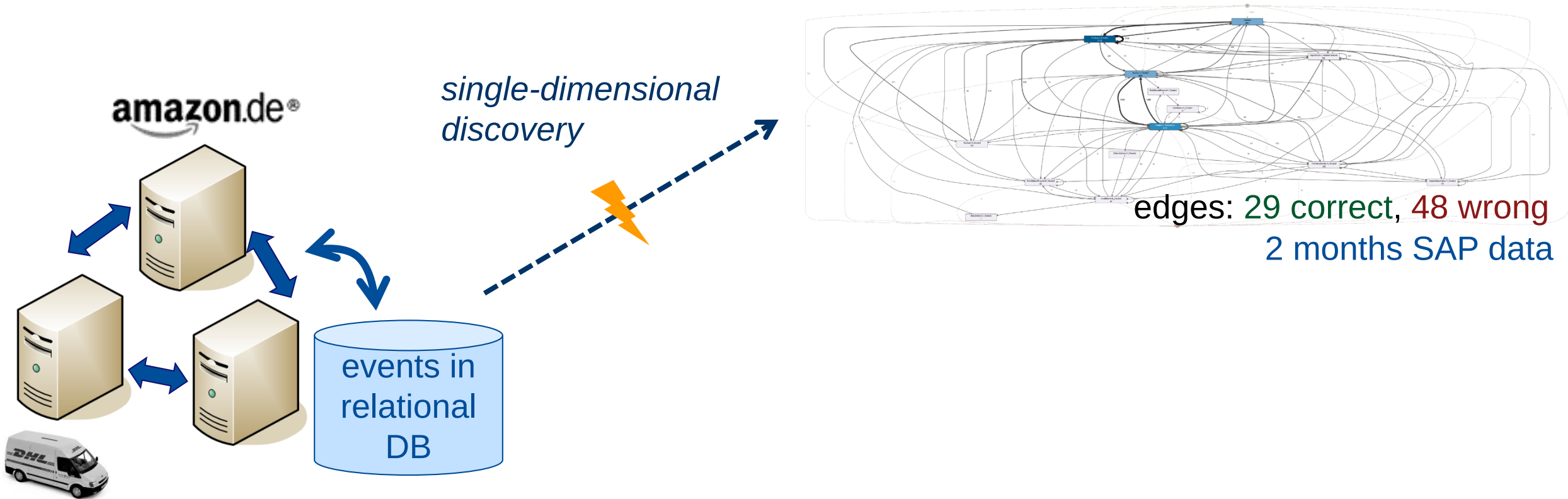
Multi-Dimensional Processes



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Process Mining on Multi-Dimensional Data

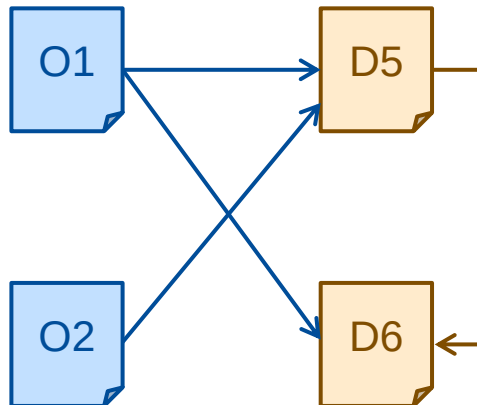
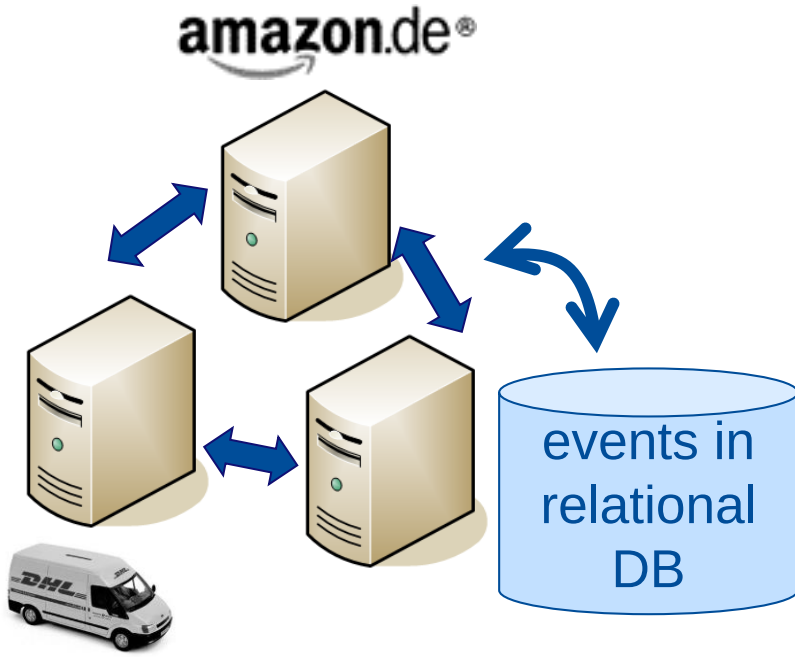


E. Nooijen, B. v. Dongen, and D. Fahland, "Automatic Discovery of Data-Centric and Artifact-Centric Processes," in BPM Workshops. Springer, 2013, pp. 316–327.

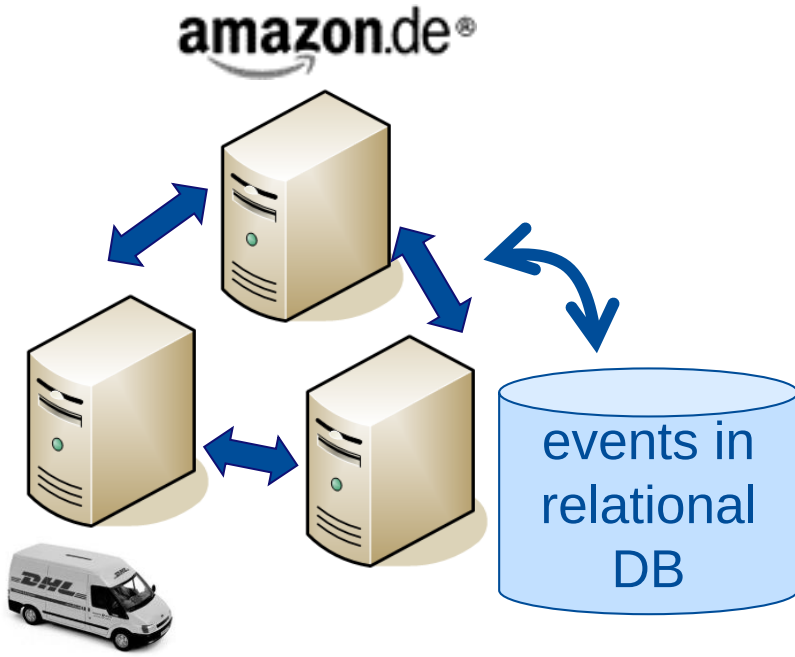
Viara Popova, Dirk Fahland, Marlon Dumas: "Artifact Lifecycle Discovery." Int. J. Cooperative Inf. Syst. 24(1) (2015)

Xixi Lu, Marijn Nagelkerke, Dirk Fahland: "Discovering Interacting Artifacts from ERP systems" IEEE Trans. On Services Computing DOI: [10.1109/TSC.2015.2474358](https://doi.org/10.1109/TSC.2015.2474358)

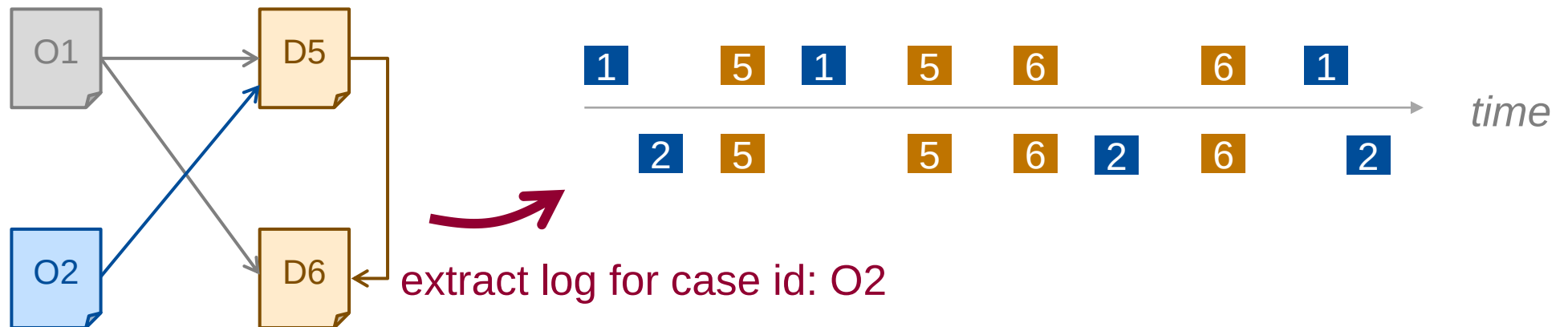
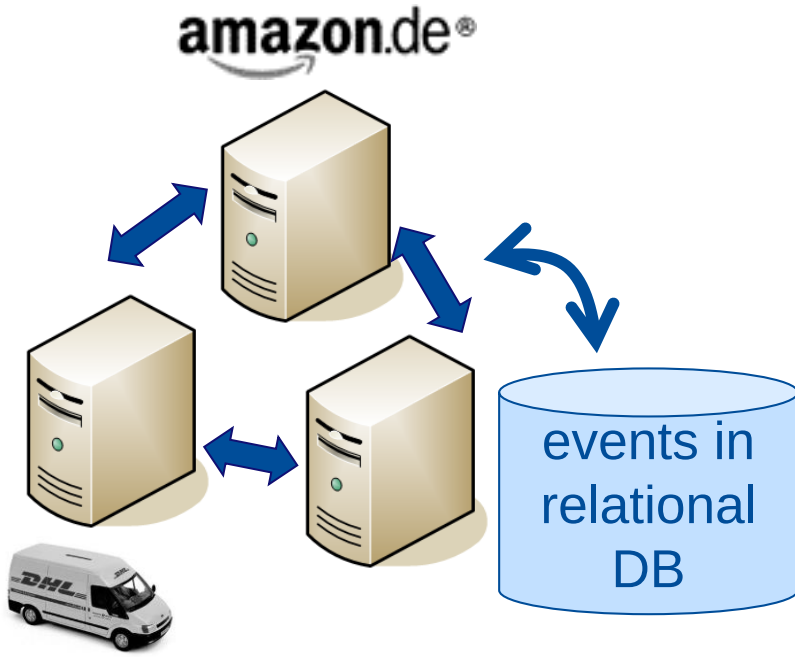
Why classical Process Mining (single case ID) fails



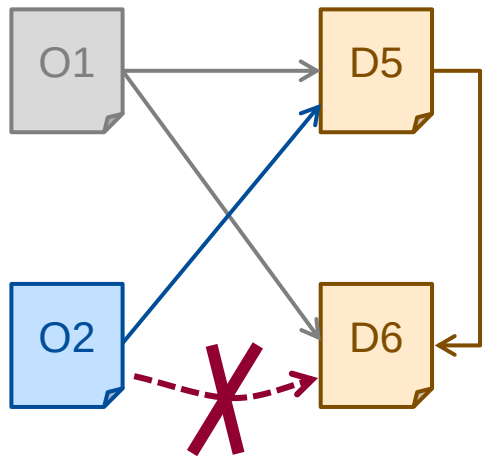
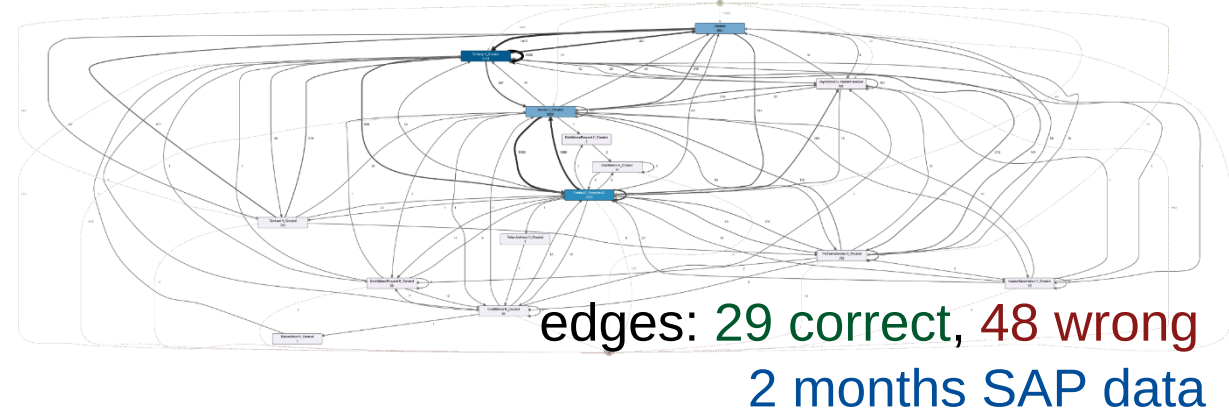
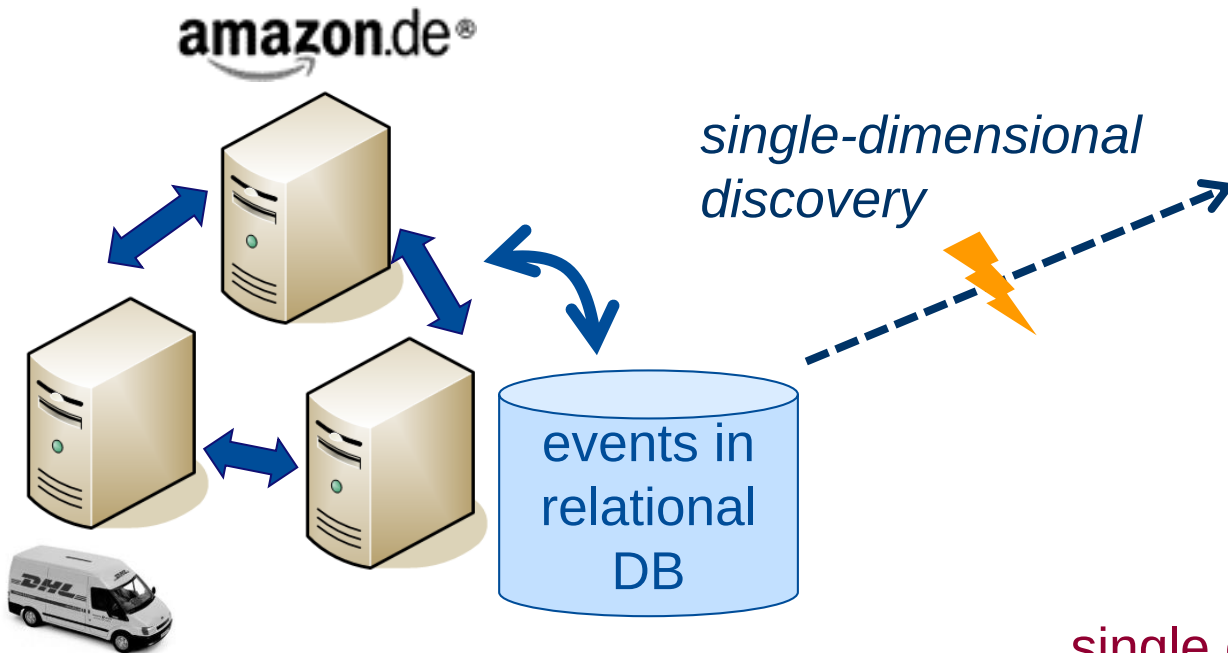
Why classical Process Mining (single case ID) fails



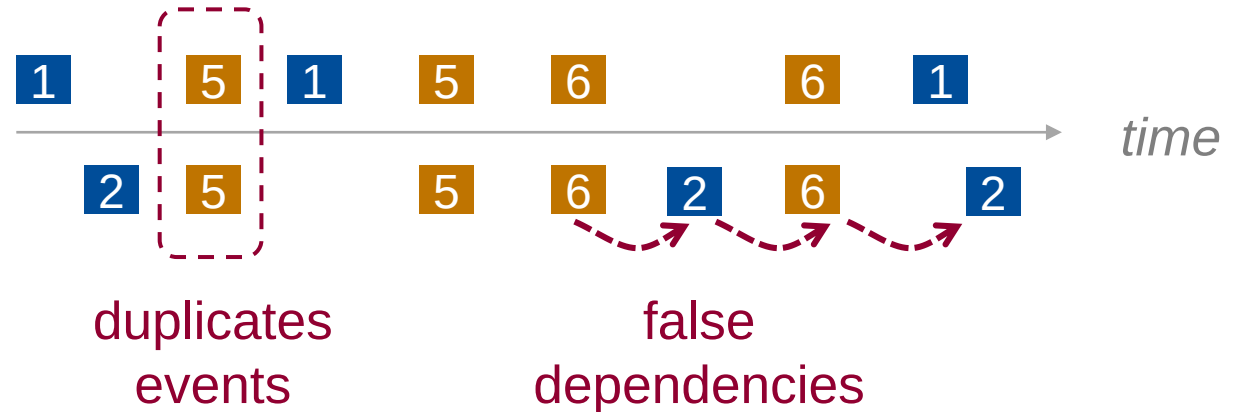
Why classical Process Mining (single case ID) fails



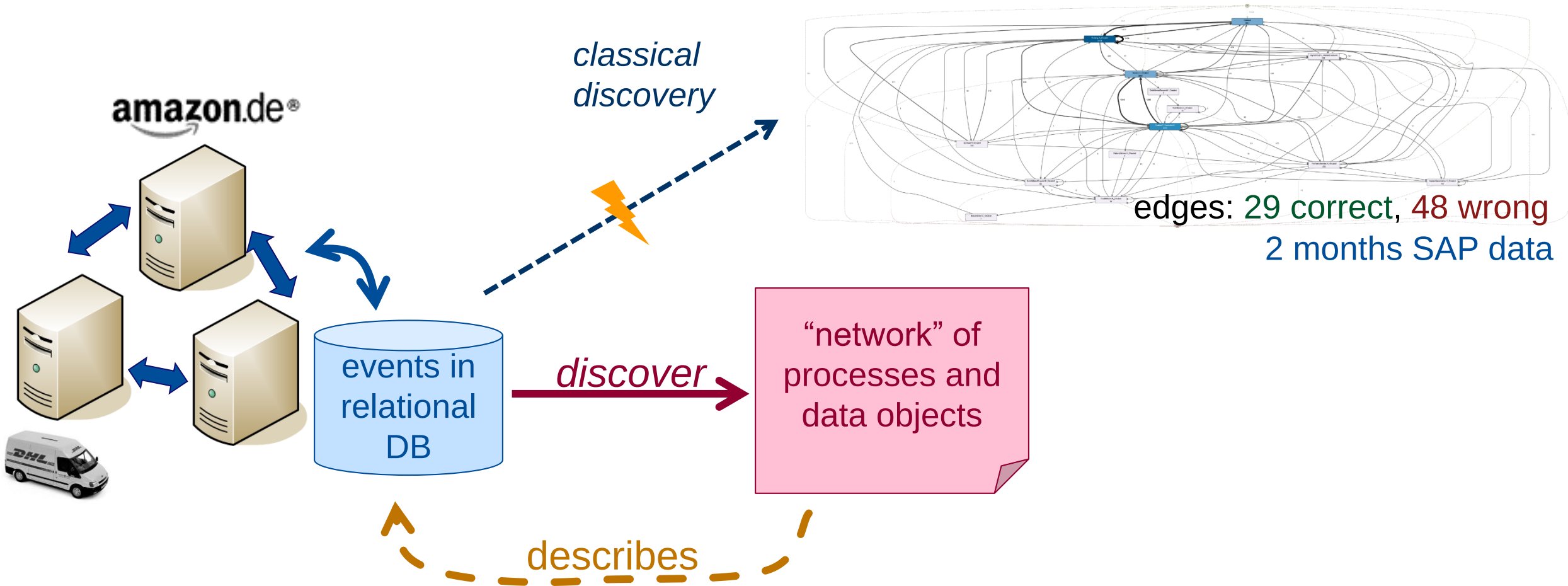
Why classical Process Mining (single case ID) fails



single case id $\rightarrow$ de-normalizes underlying data-structure



“Network” Process Mining



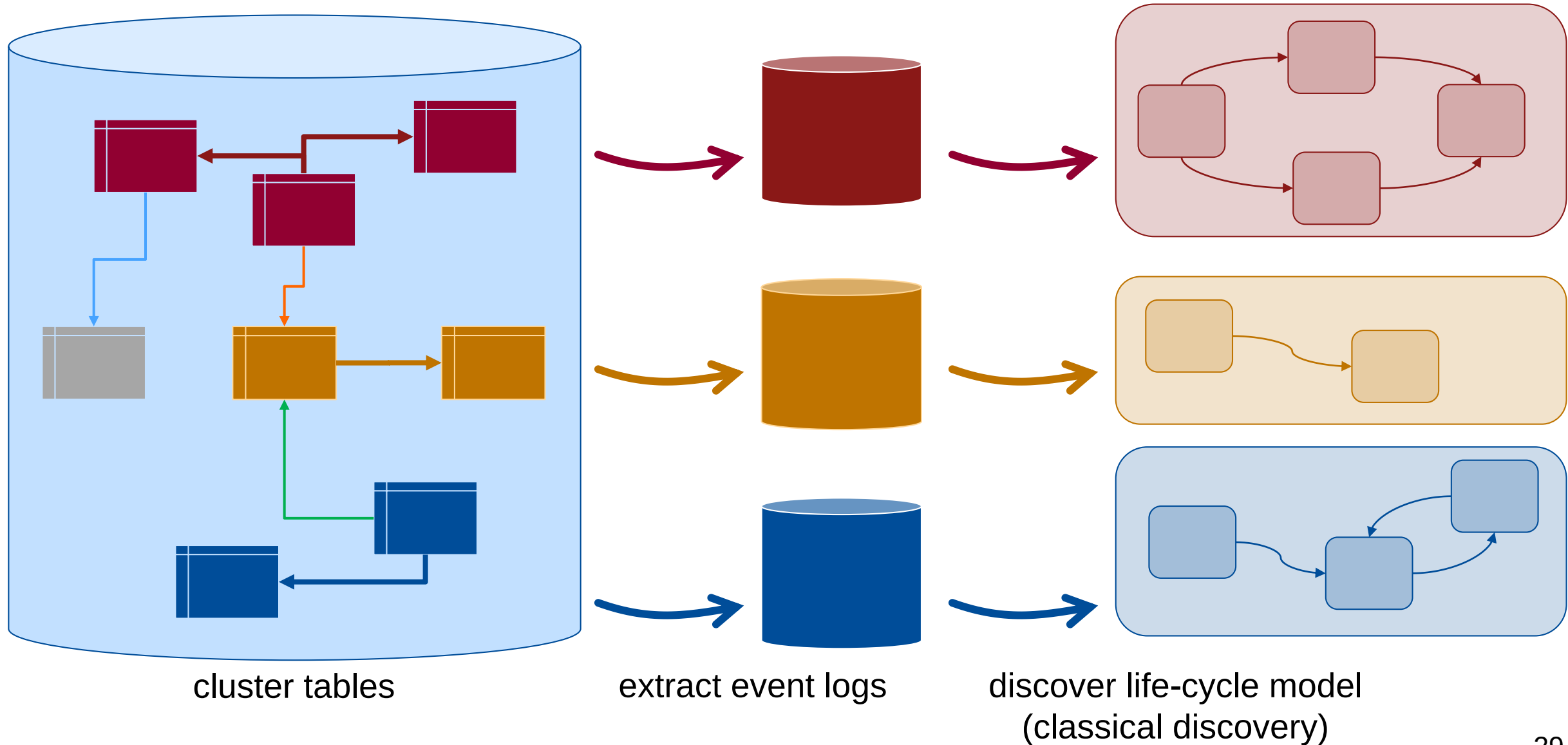
E. Nooijen, B. v. Dongen, and D. Fahland, “Automatic Discovery of Data-Centric and Artifact-Centric Processes,” in BPM Workshops. Springer, 2013, pp. 316–327.

Viara Popova, Dirk Fahland, Marlon Dumas: “Artifact Lifecycle Discovery.” Int. J. Cooperative Inf. Syst. 24(1) (2015)

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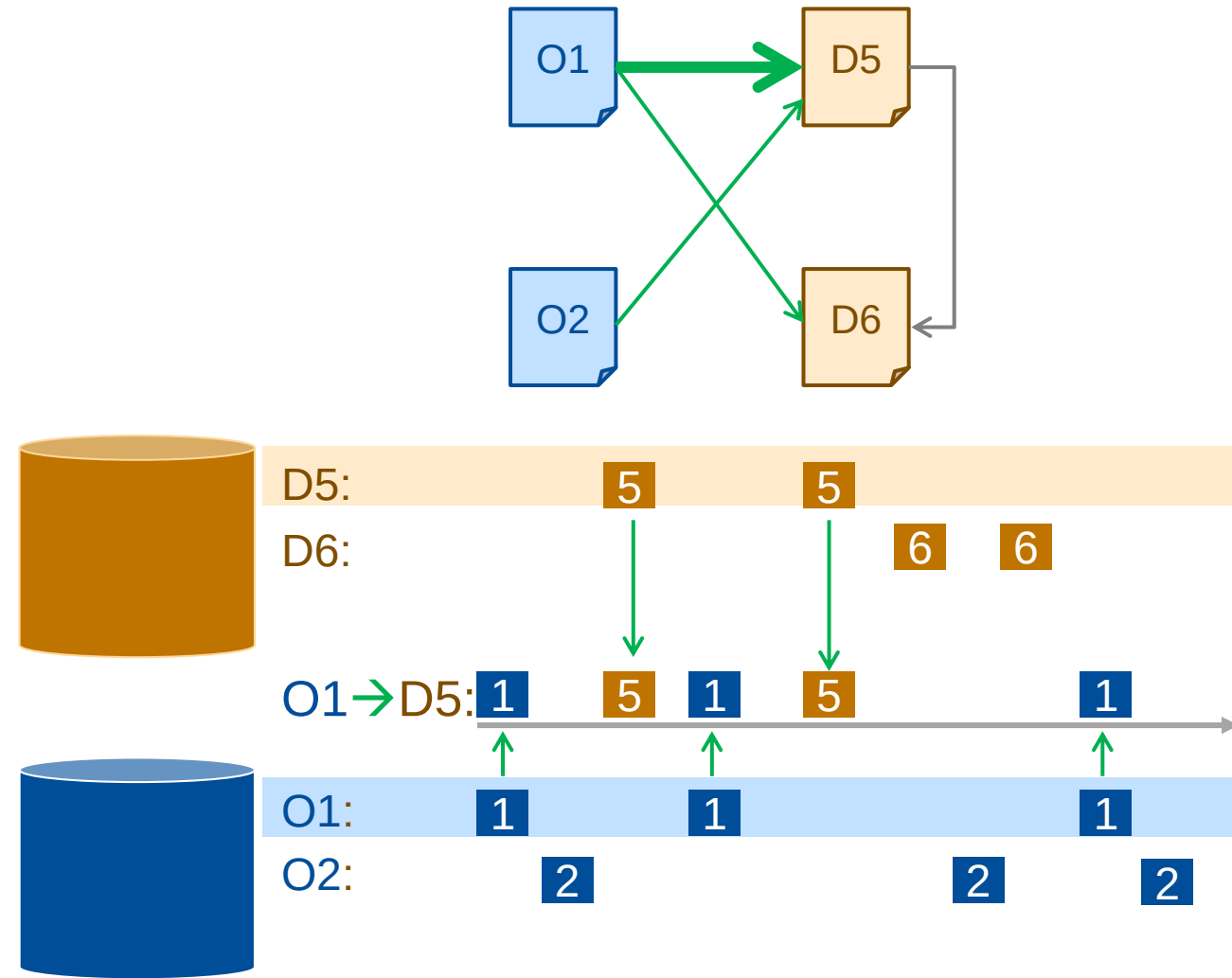
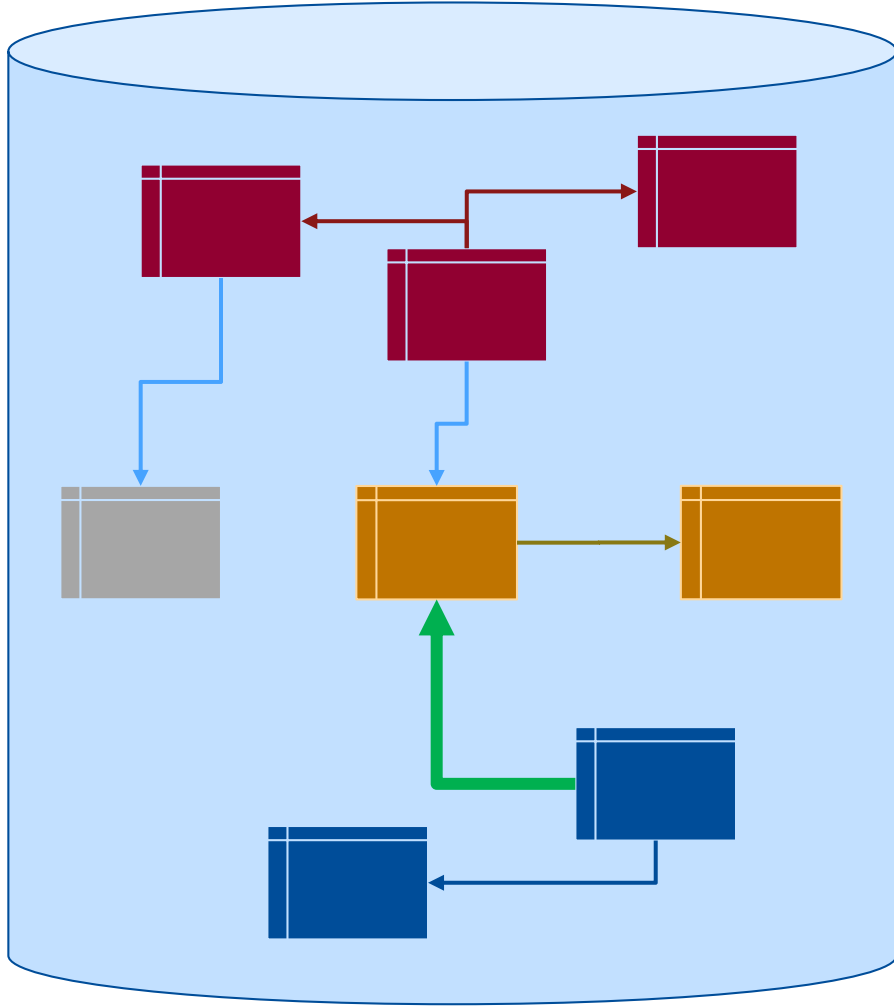
Discover Objects & Life-Cycles

[Nooijen et al. 2013, Lu et al. 2015]

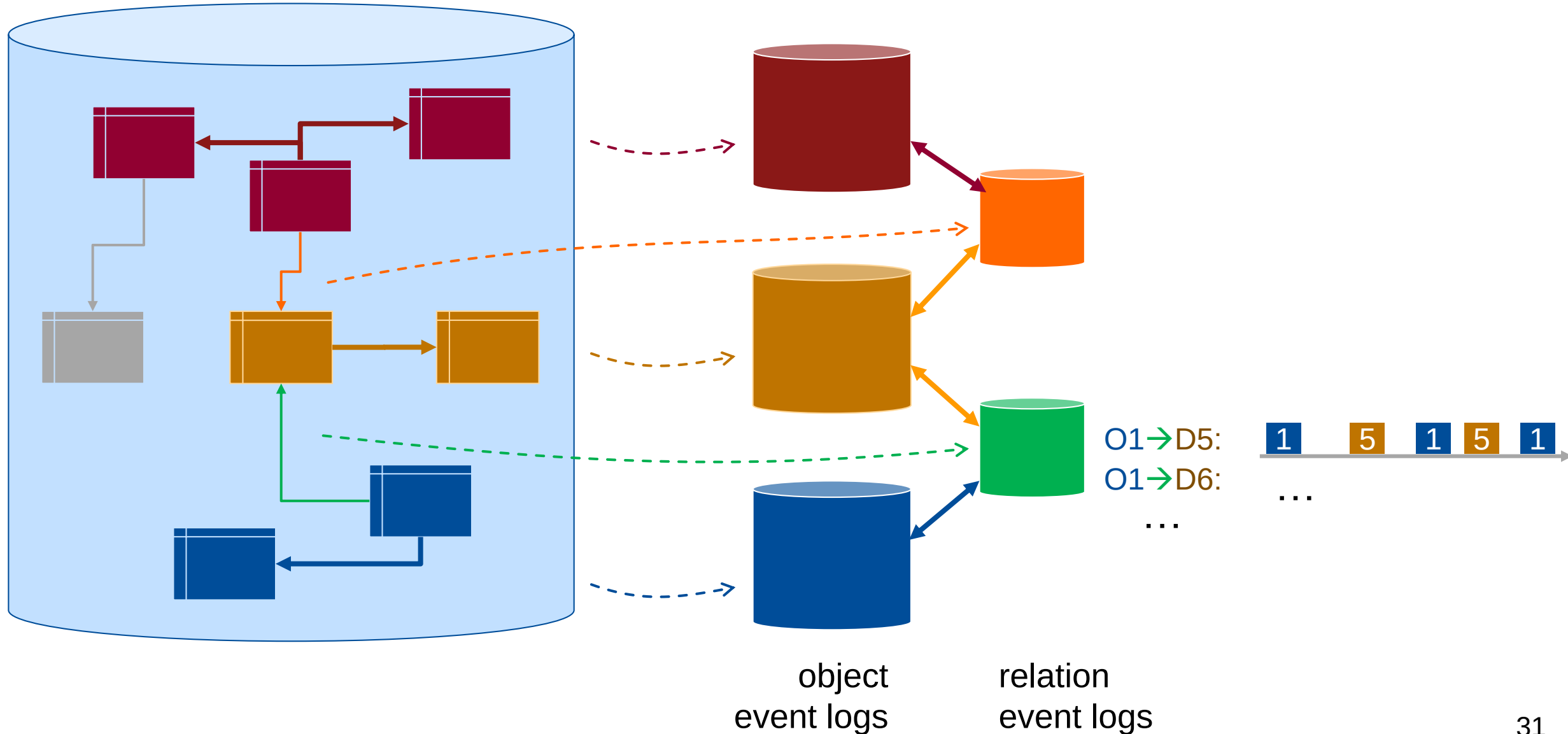


... and Relations

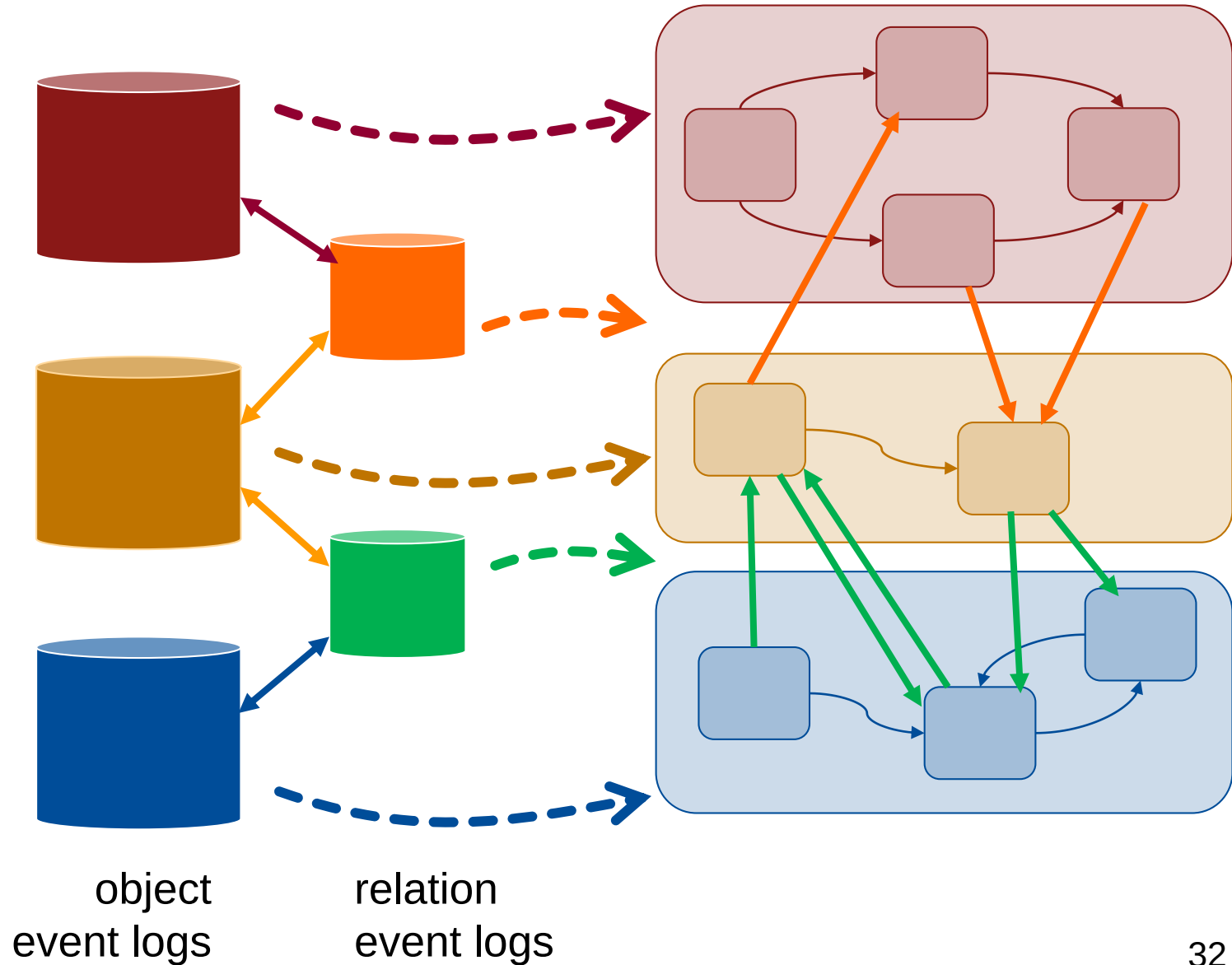
[Lu et al. 2015]



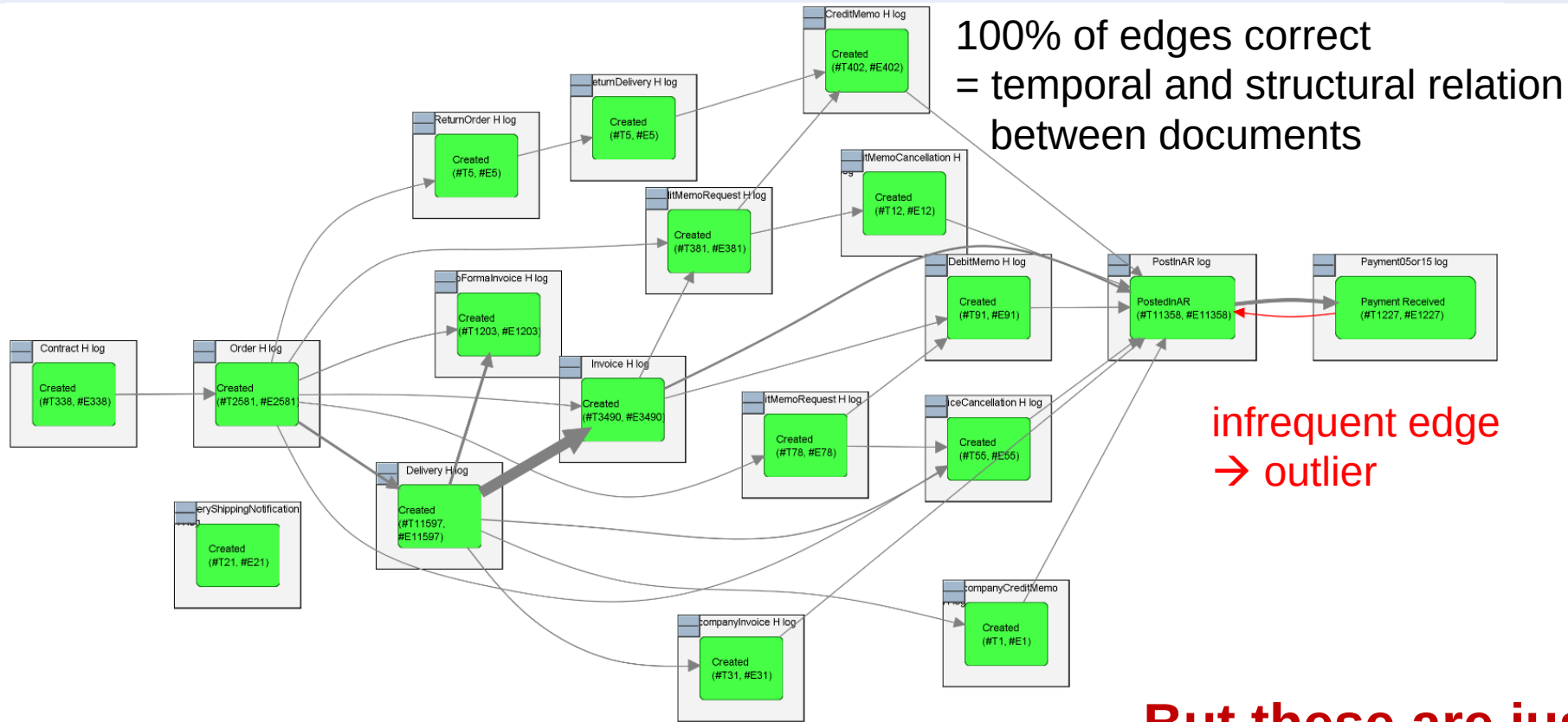
Network of Event logs (linked via shared events)



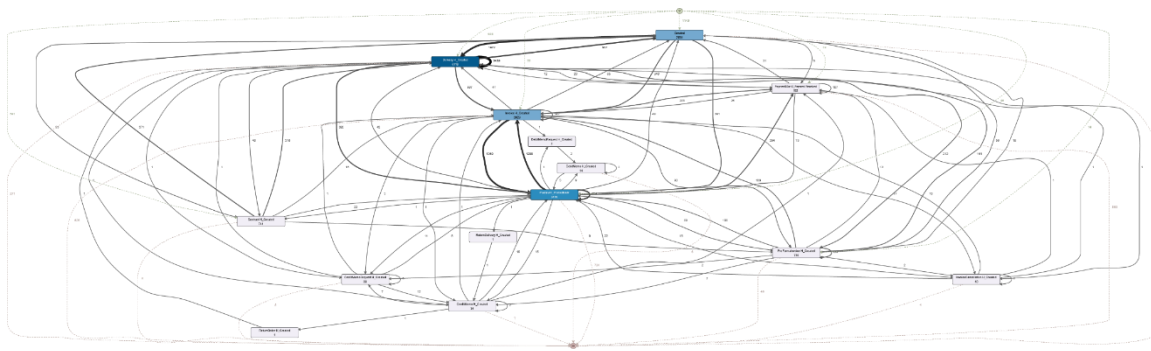
Process Mining in Networks of Event Logs



SAP Order-To-Cash “Artifact-Centric Model”



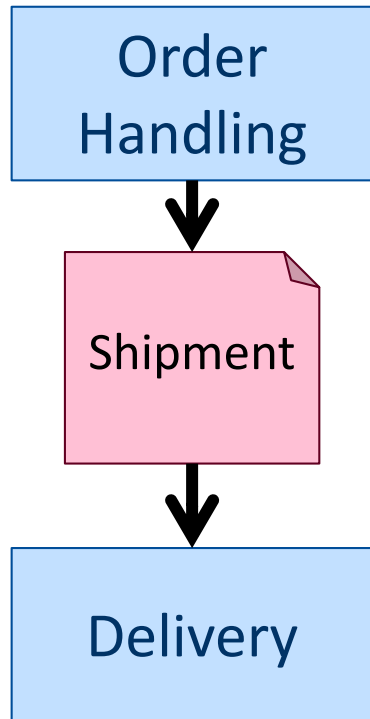
But these are just pictures!



29/77 correct
edges

Understandable Multi-Dimensional Processes

high-level
process model

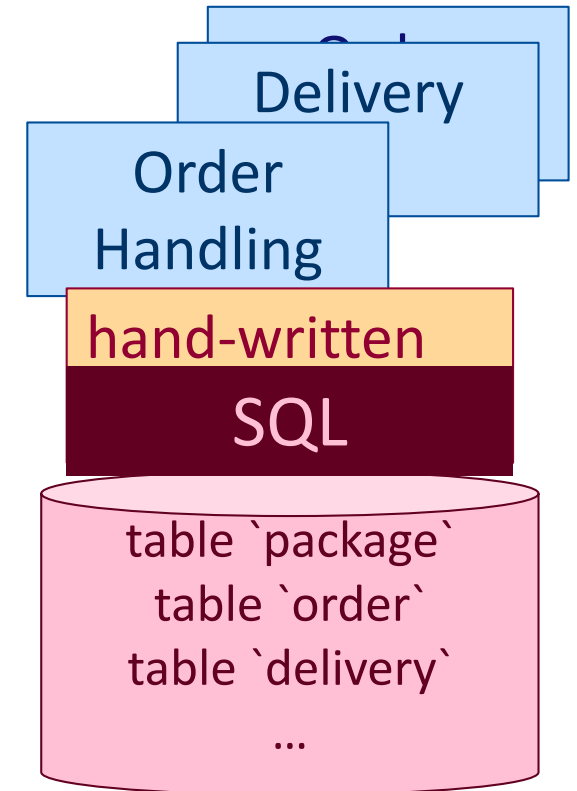


simple to understand
but too imprecise



precise but non-
understandable,
non-analyzable

implemented
processes

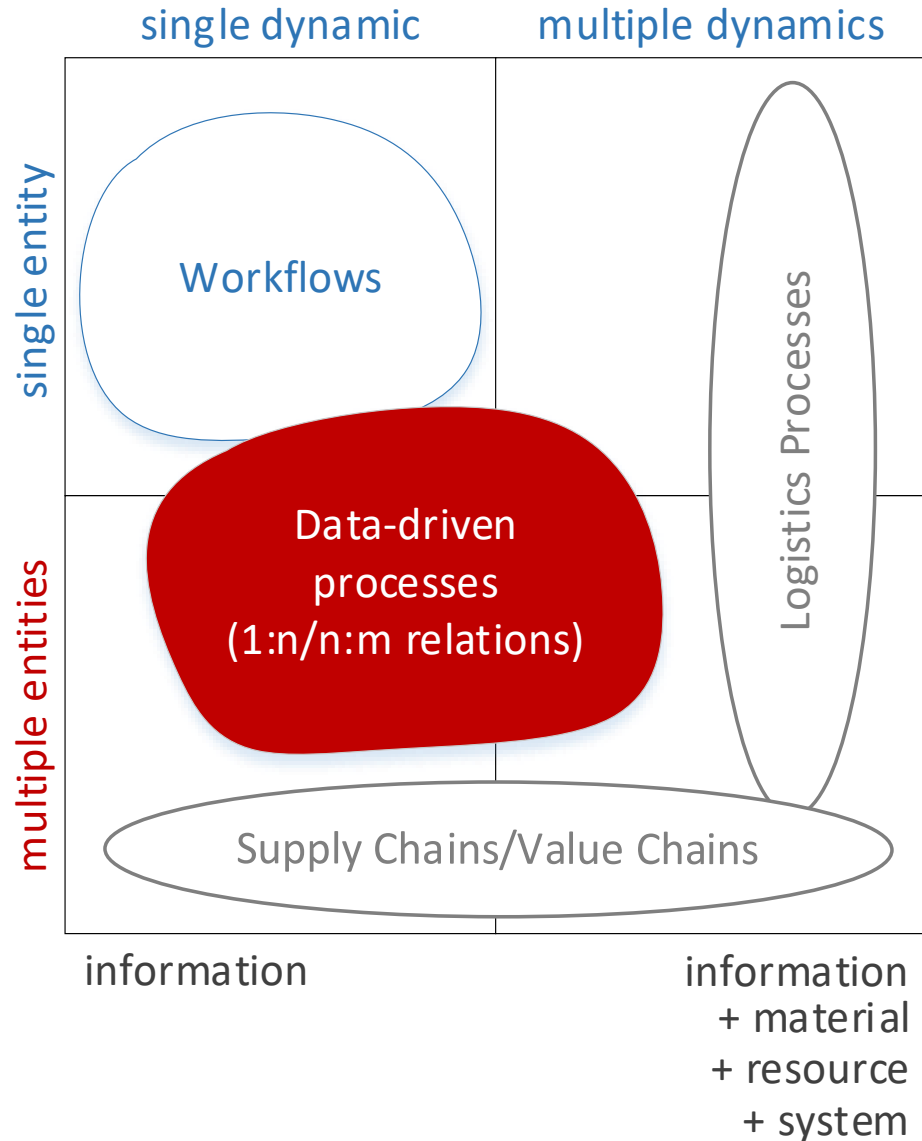


abstract graphical concepts

written code

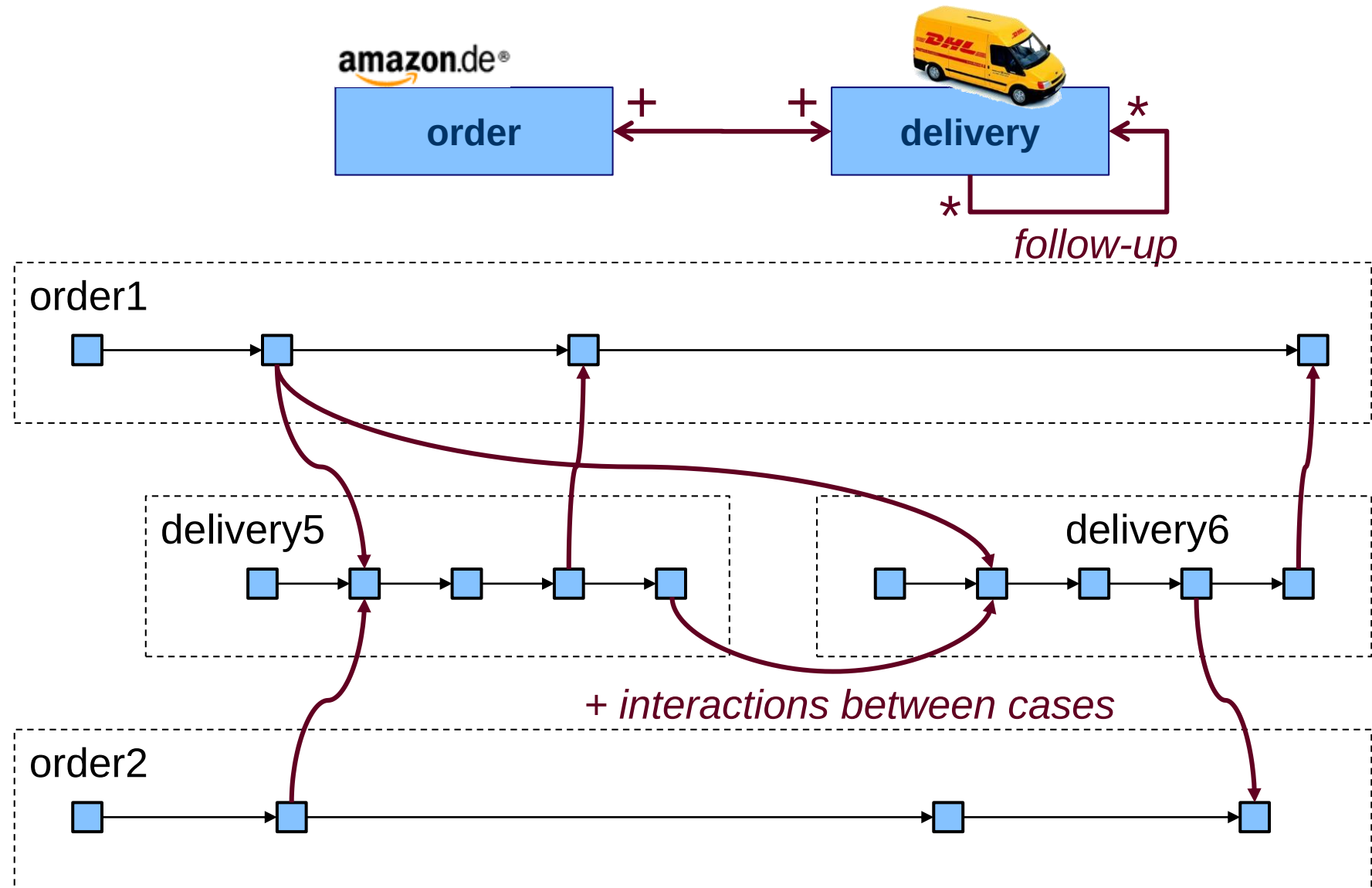
complexity

Multi-Dimensional Processes

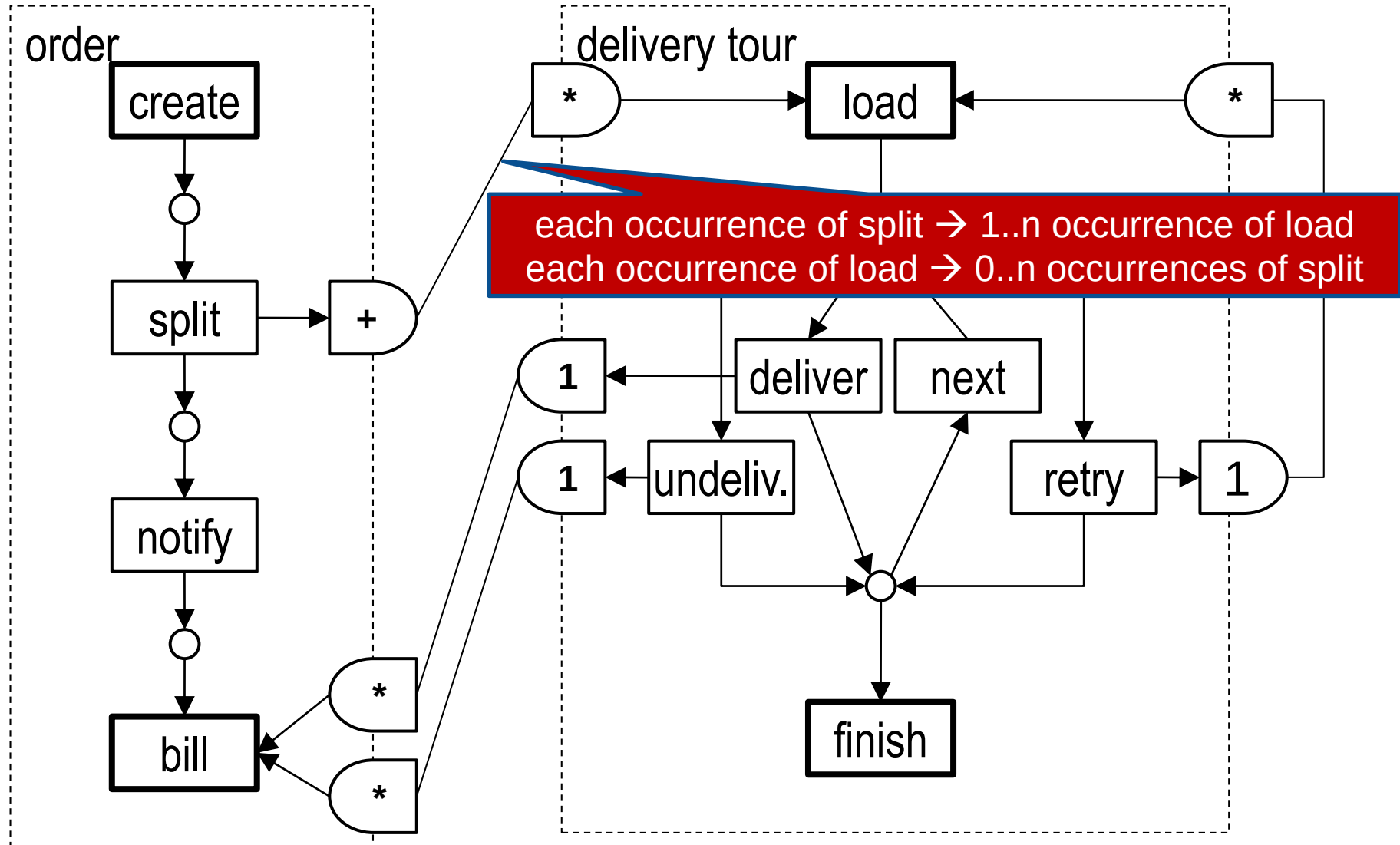


- Processes with multiple entities
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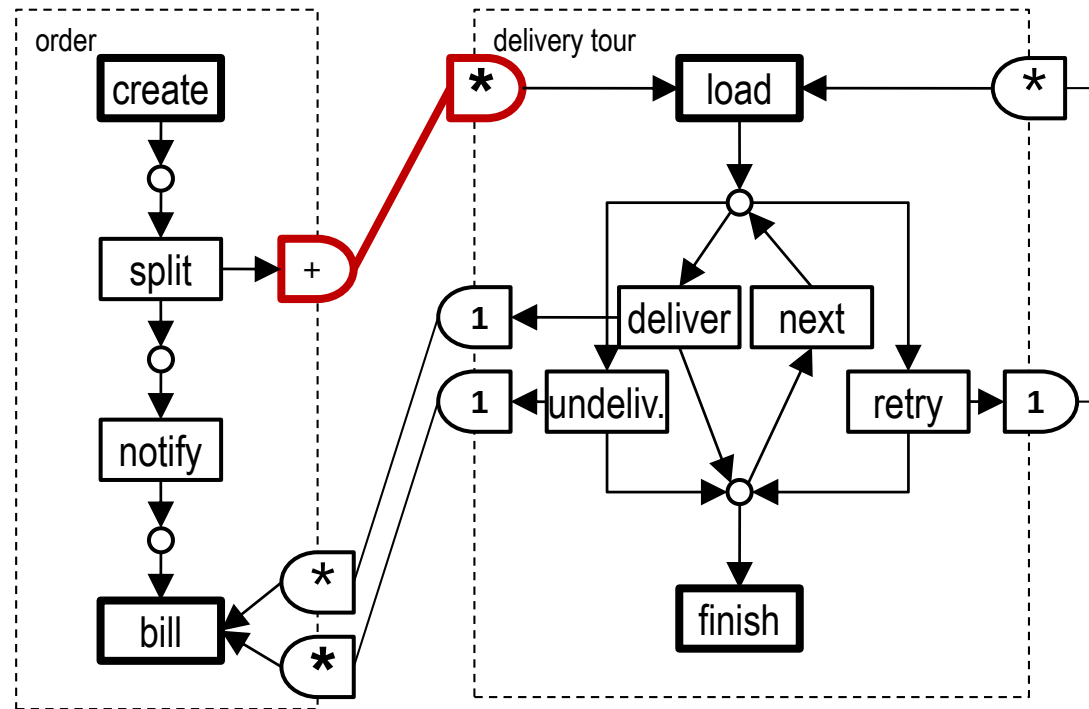
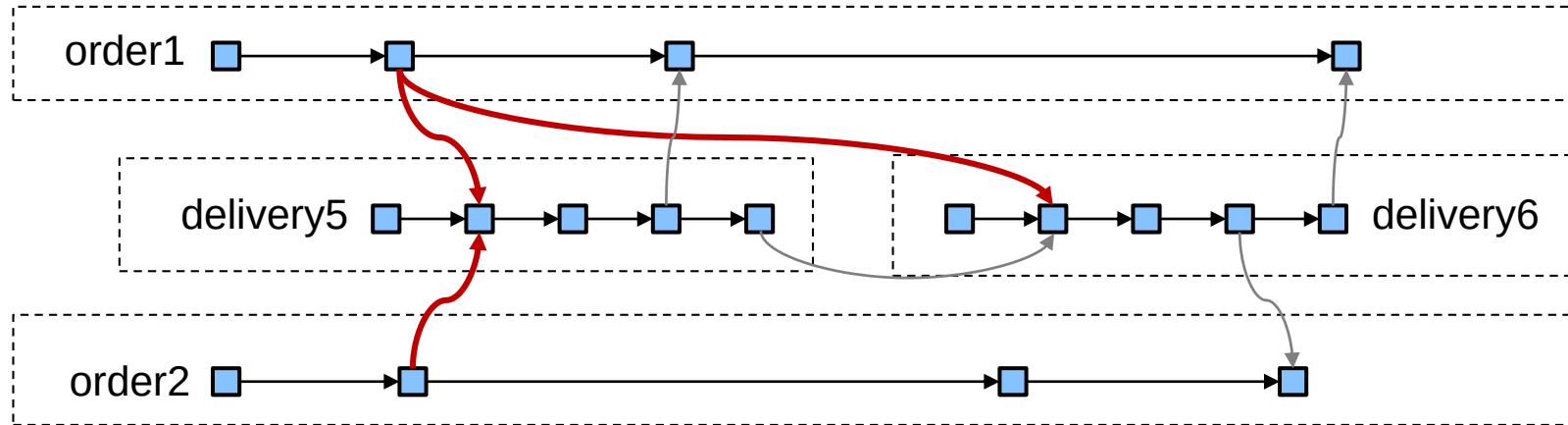
Need a model that can produce such a run:



Proclets: Cardinalities between events

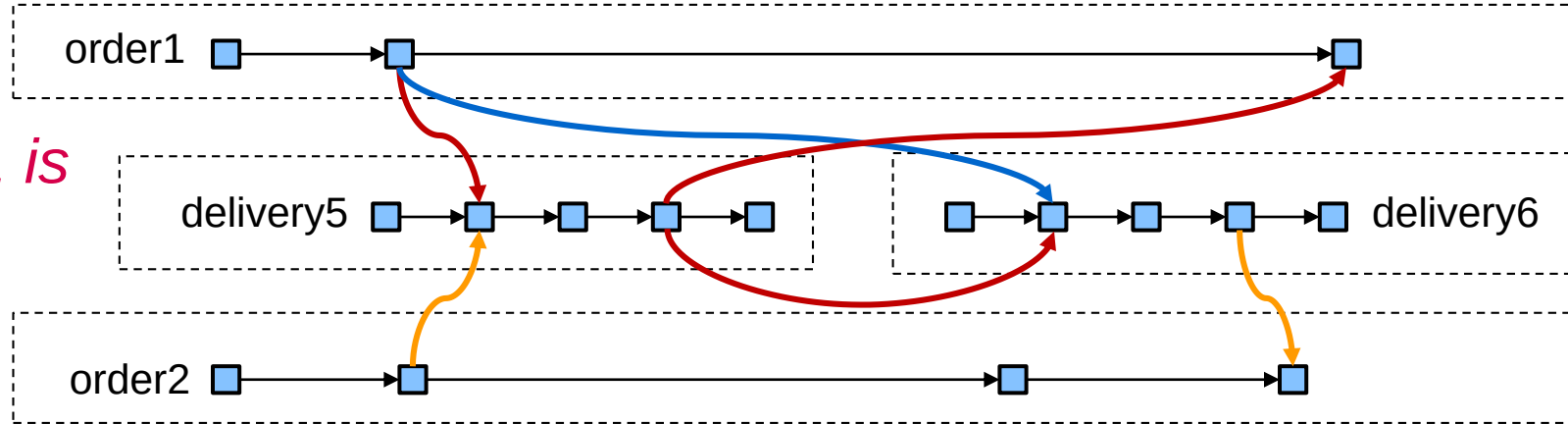


Cardinalities constrain possible n:m interactions



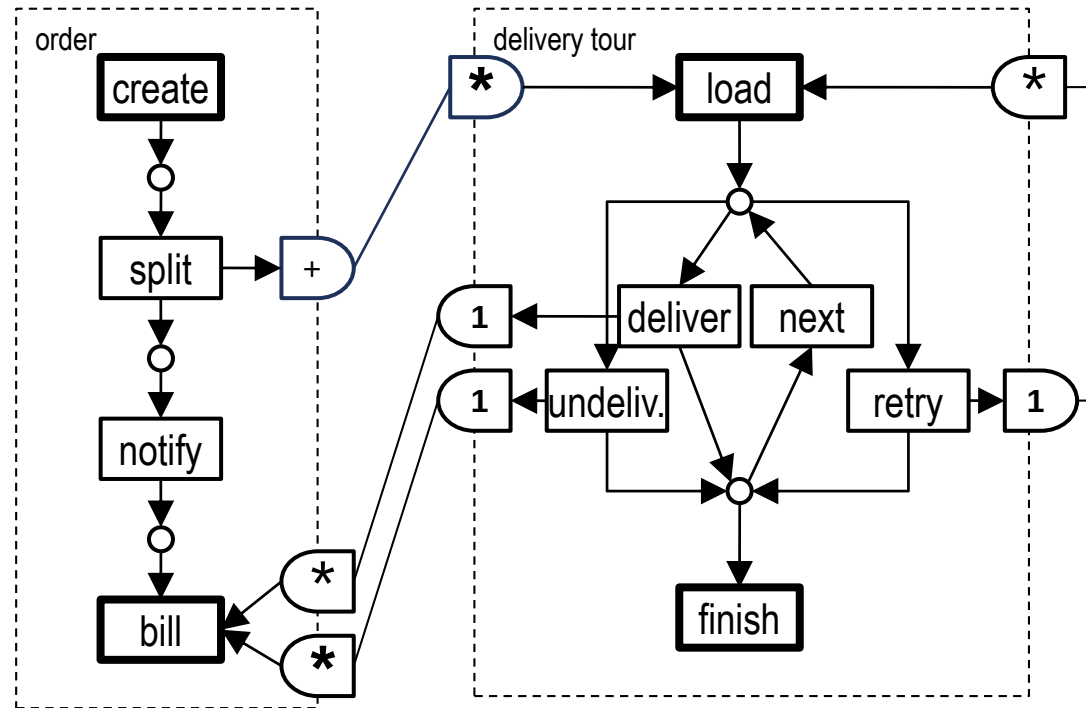
Problem: Cardinalities do NOT preserve objects

package21 is duplicated



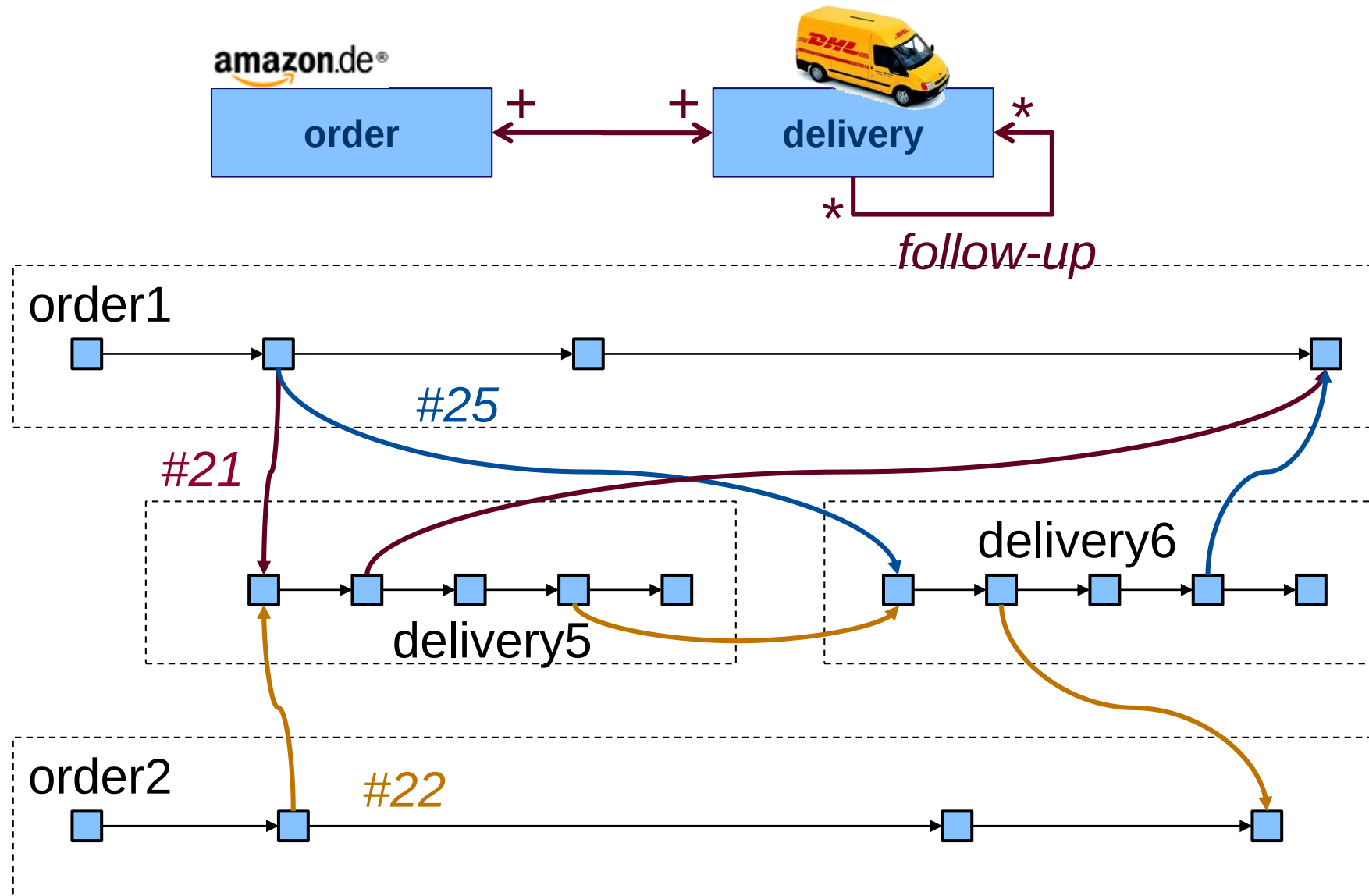
package25 is lost

package22 teleports

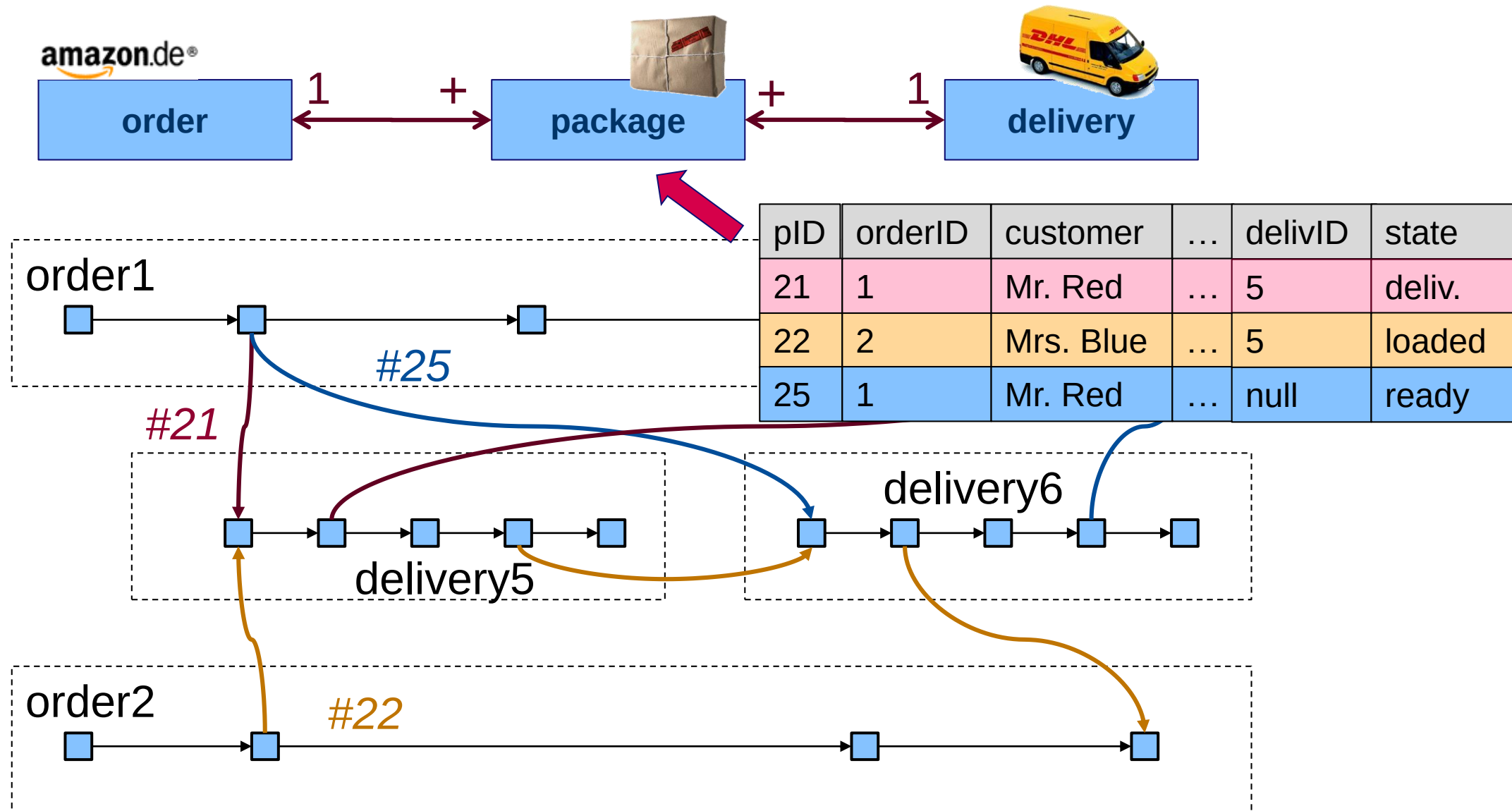


... but cardinality constraints satisfied

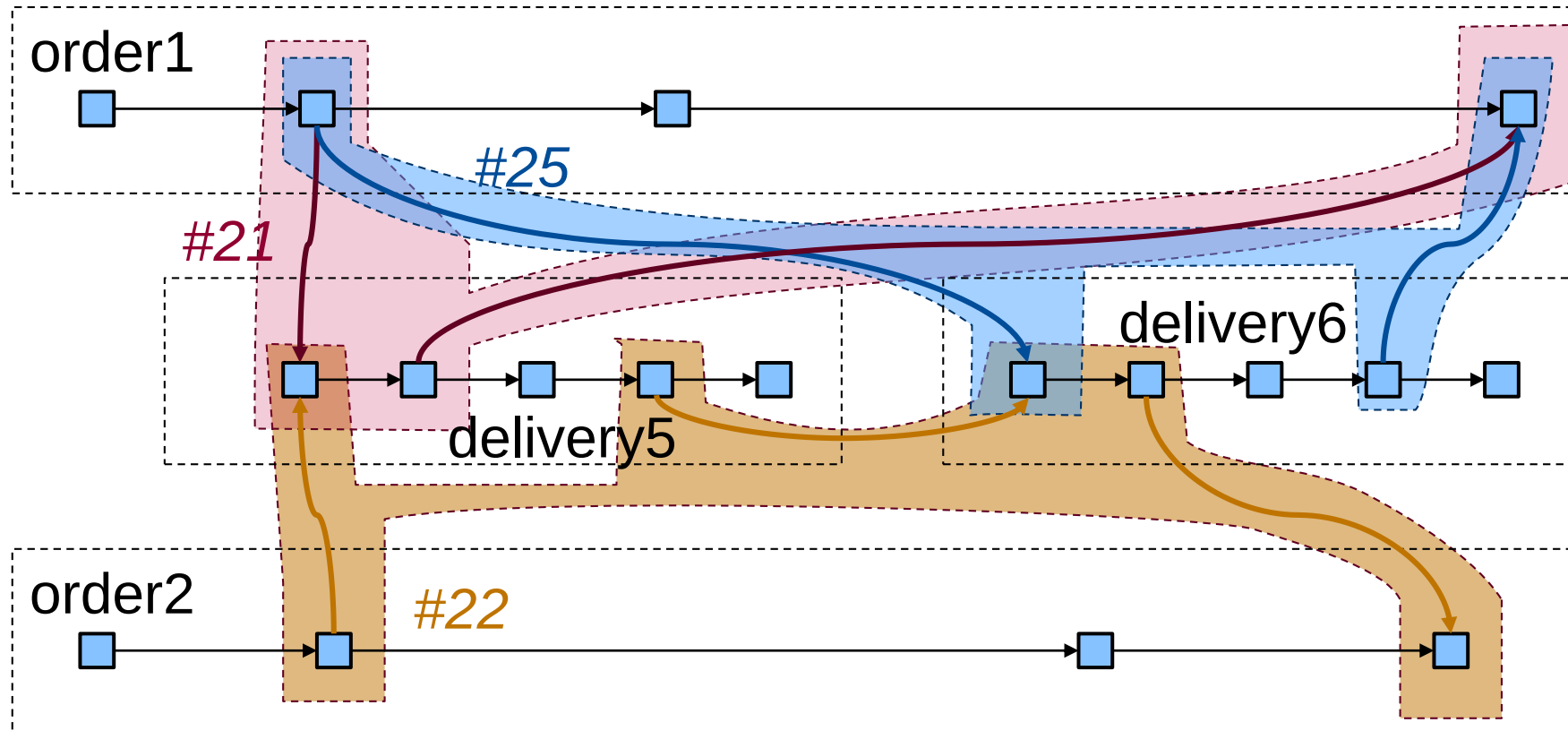
So what's the problem with M:N relationships?



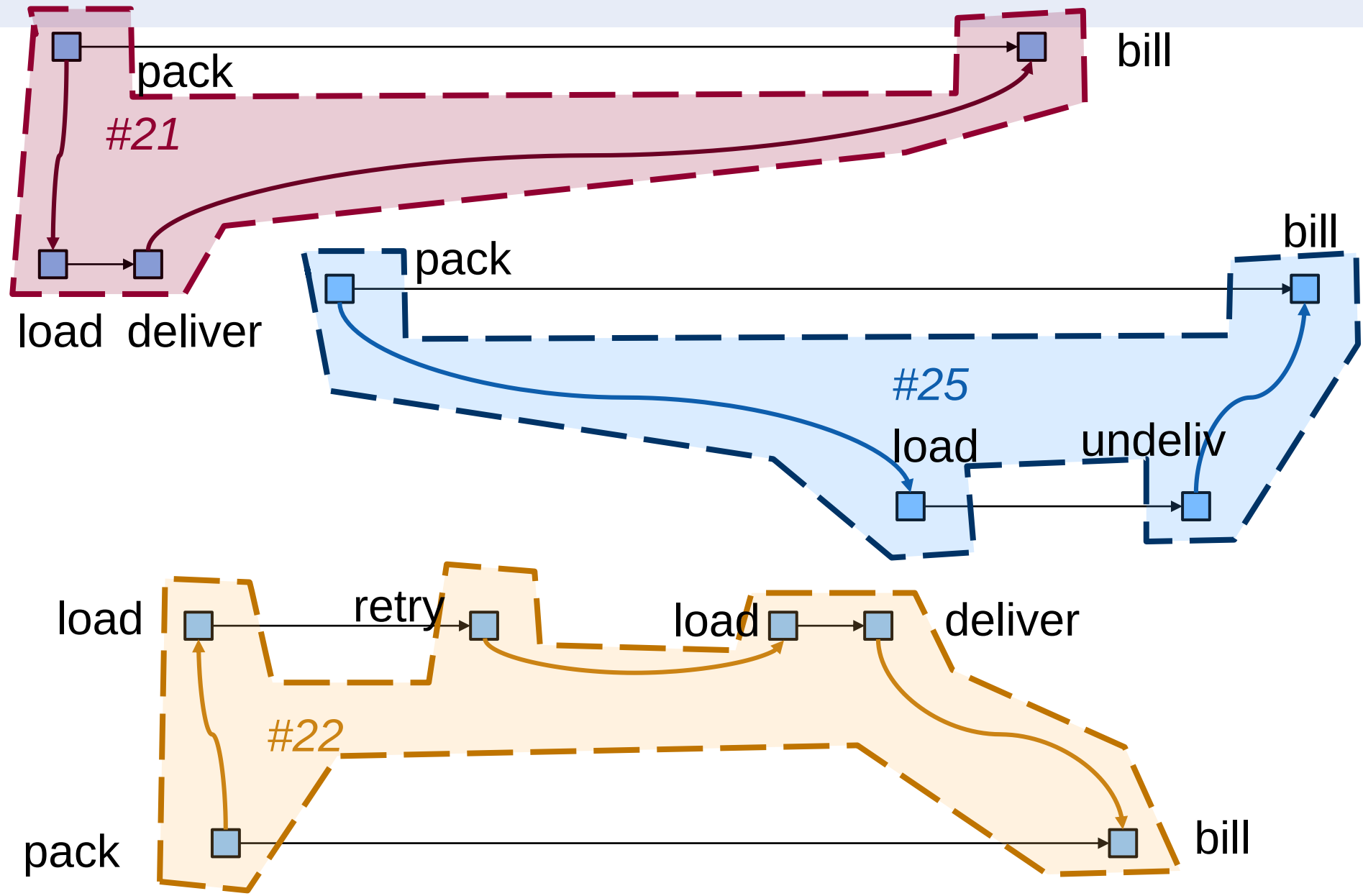
Reify Relation $\rightarrow$ 2nd Normal Form



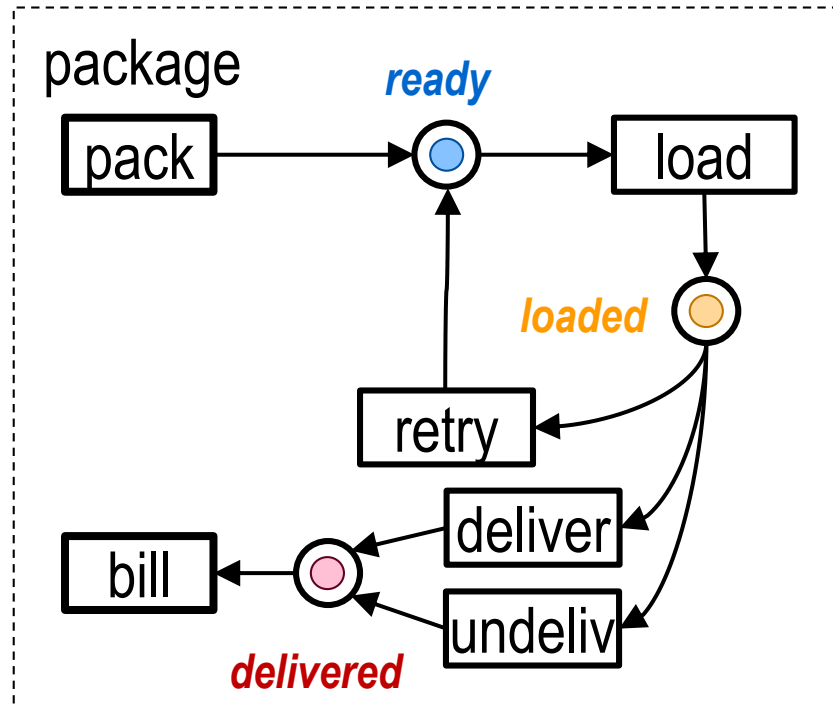
Reify Relation $\rightarrow$ Reify Behavior



3 Conversations = Behavior of an Object “Package”

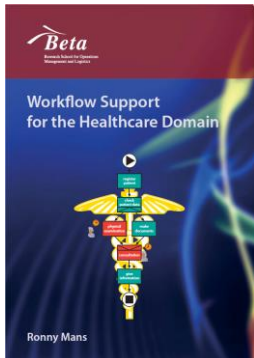


Behavioral Model for Object Package



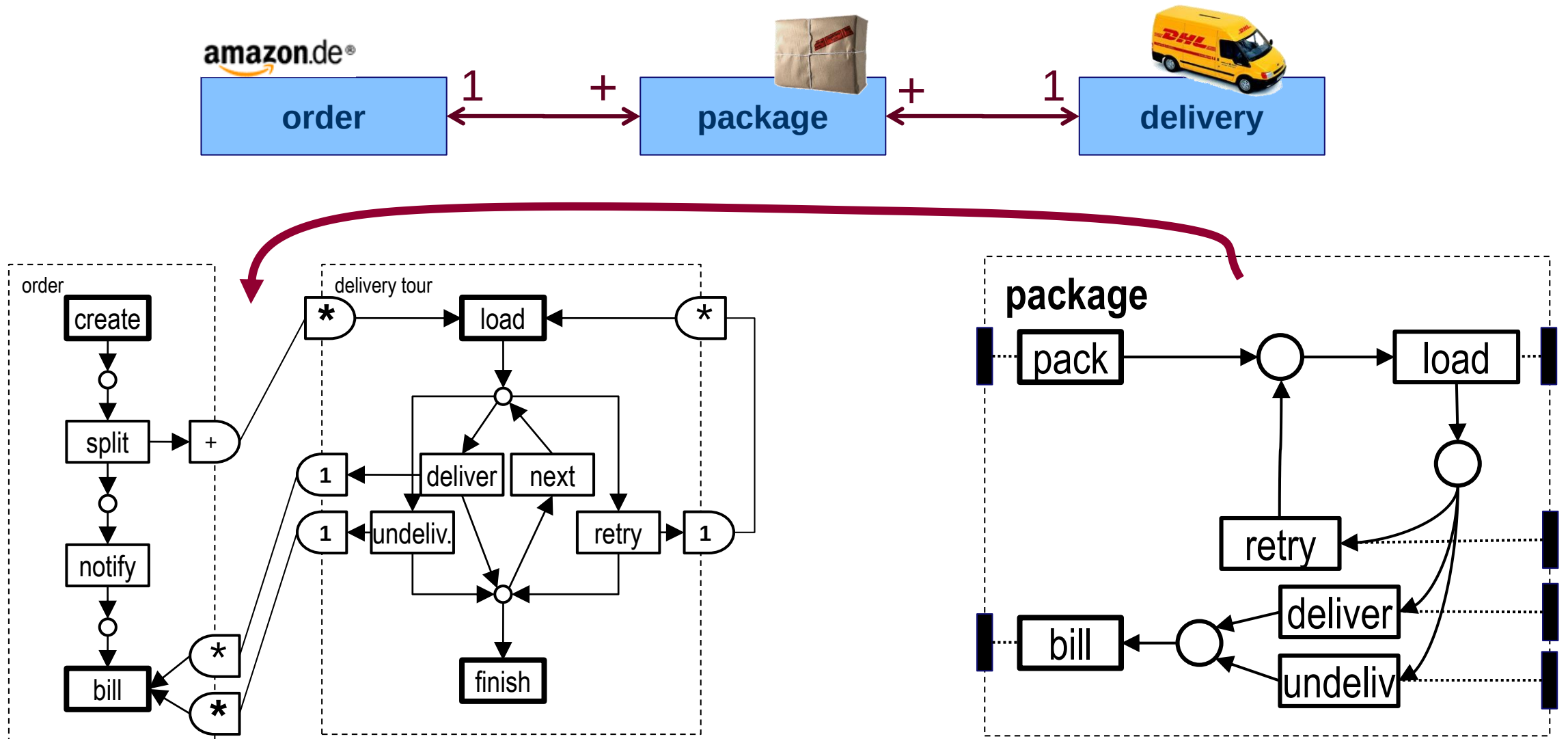
states in life-cycle model abstract from attribute values in data model

pID	orderID	customer	...	delivID	state
21	1	Mr. Red	...	5	deliv.
22	2	Mrs. Blue	...	5	loaded
25	1	Mr. Red	...	null	ready

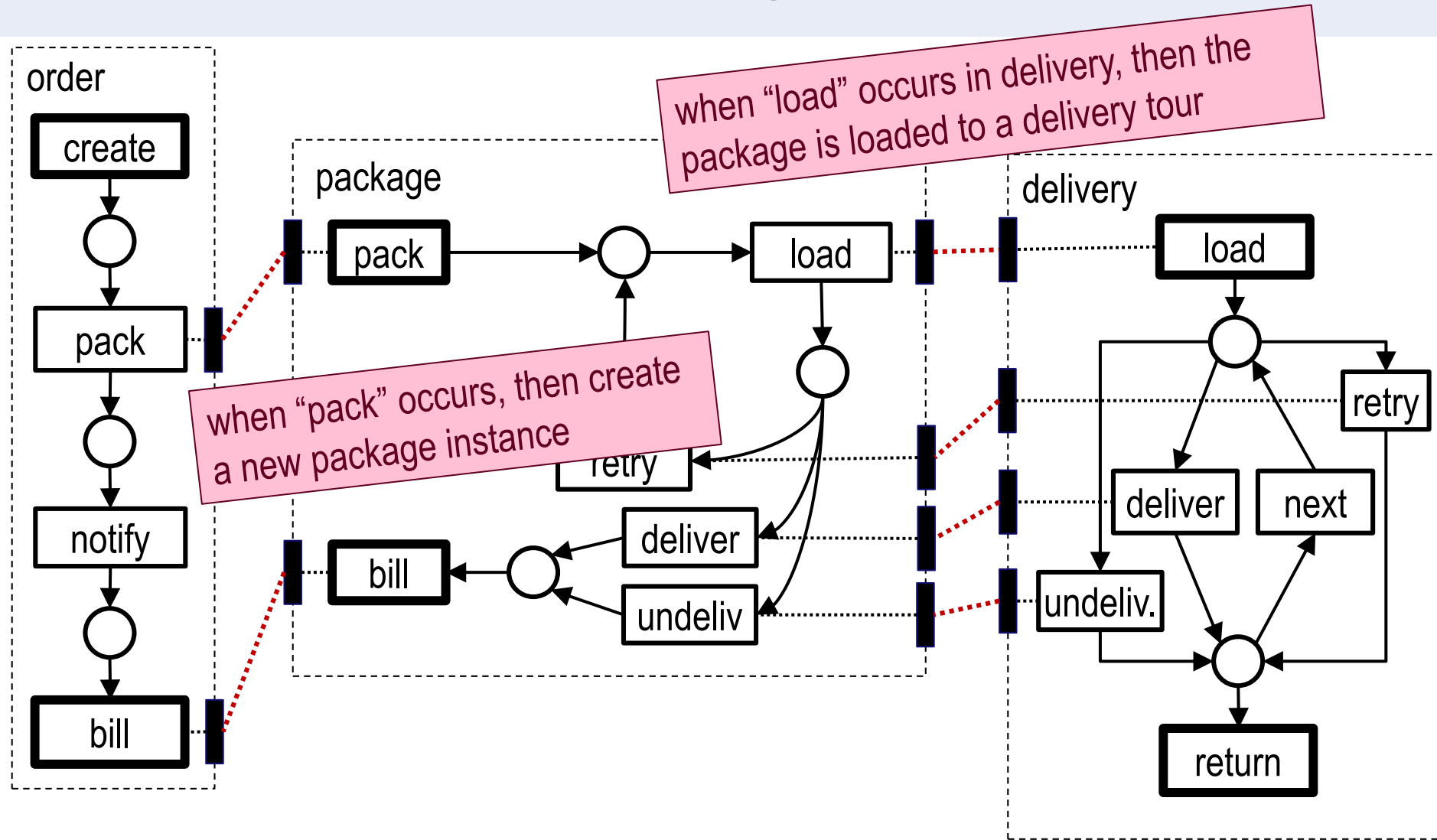


Precursor to this idea in: Ronny Mans. Workflow Support for the Healthcare Domain. PhD Thesis. 2011, Ch. 6.

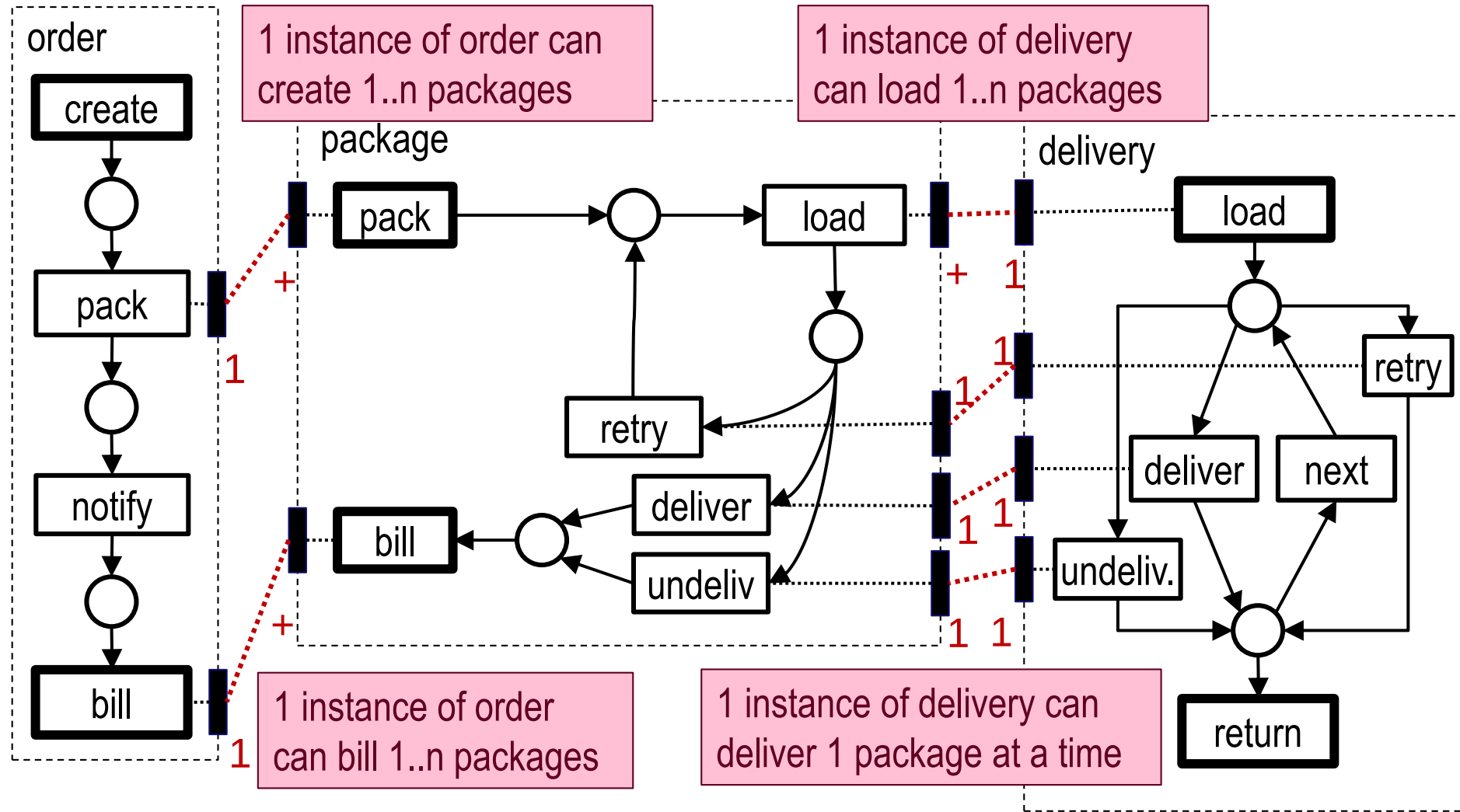
Reify Behavioral Model → Normal Form



Behavioral Normal Form: Synchronous Interaction



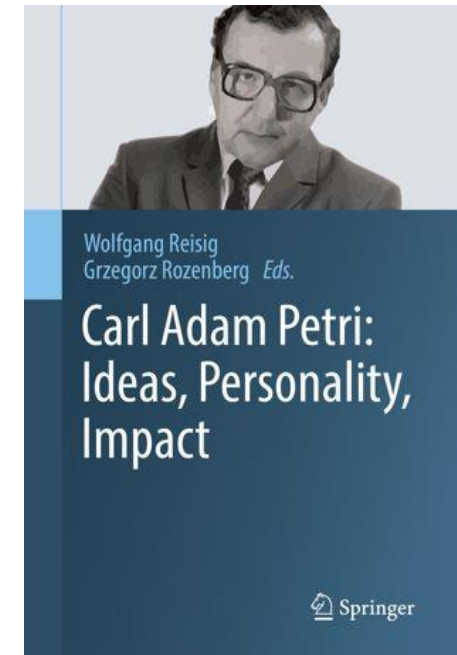
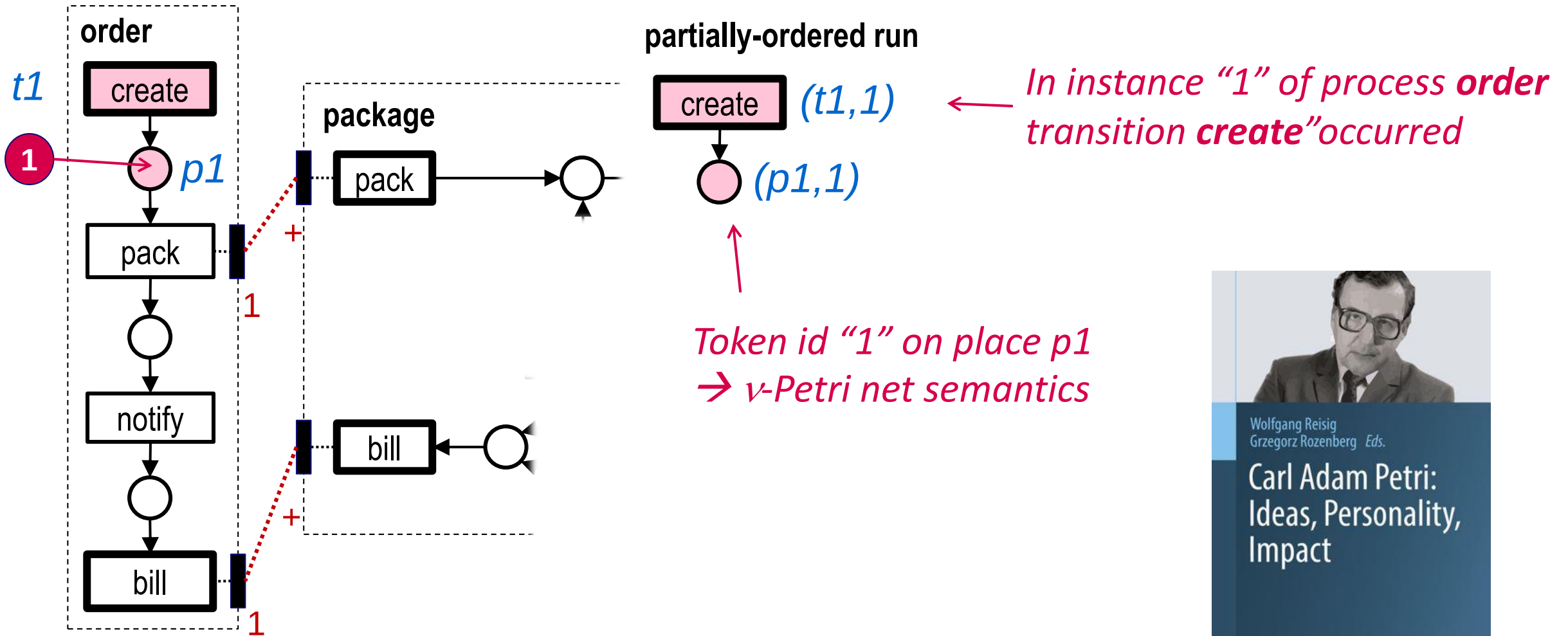
... with 1:1/1:N synchronization only: Normal Form!



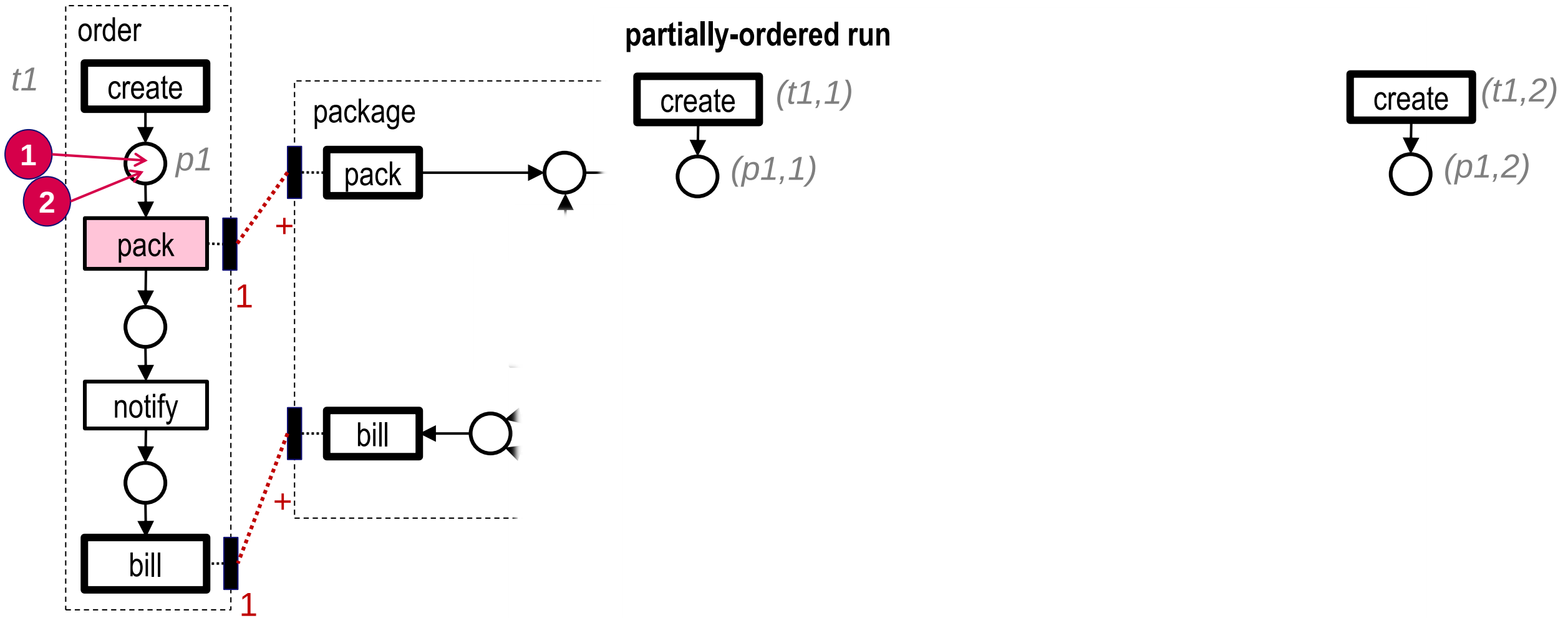
formal model in paper is general, allows N:M synchronization

Dirk Fahland "Describing Behavior of Processes with Many-to-Many Interactions", Petri Nets 2019

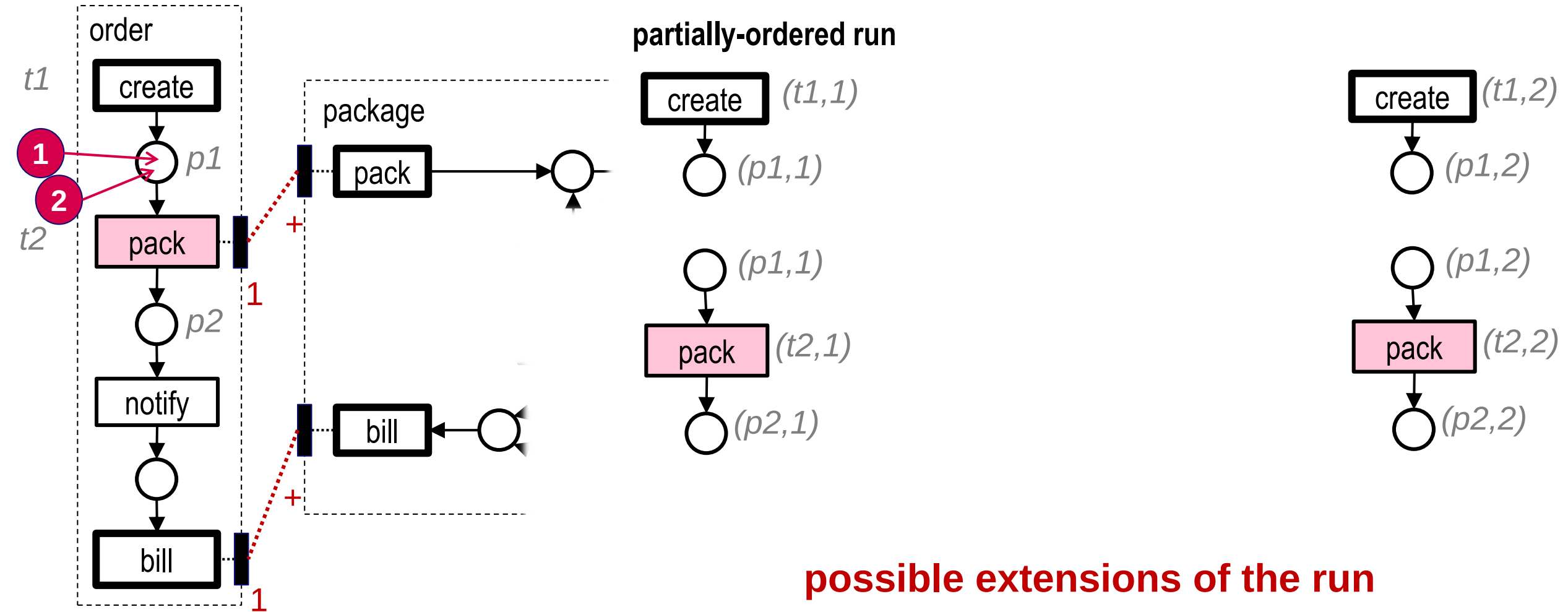
Semantics: As “net-affine” as I could make it



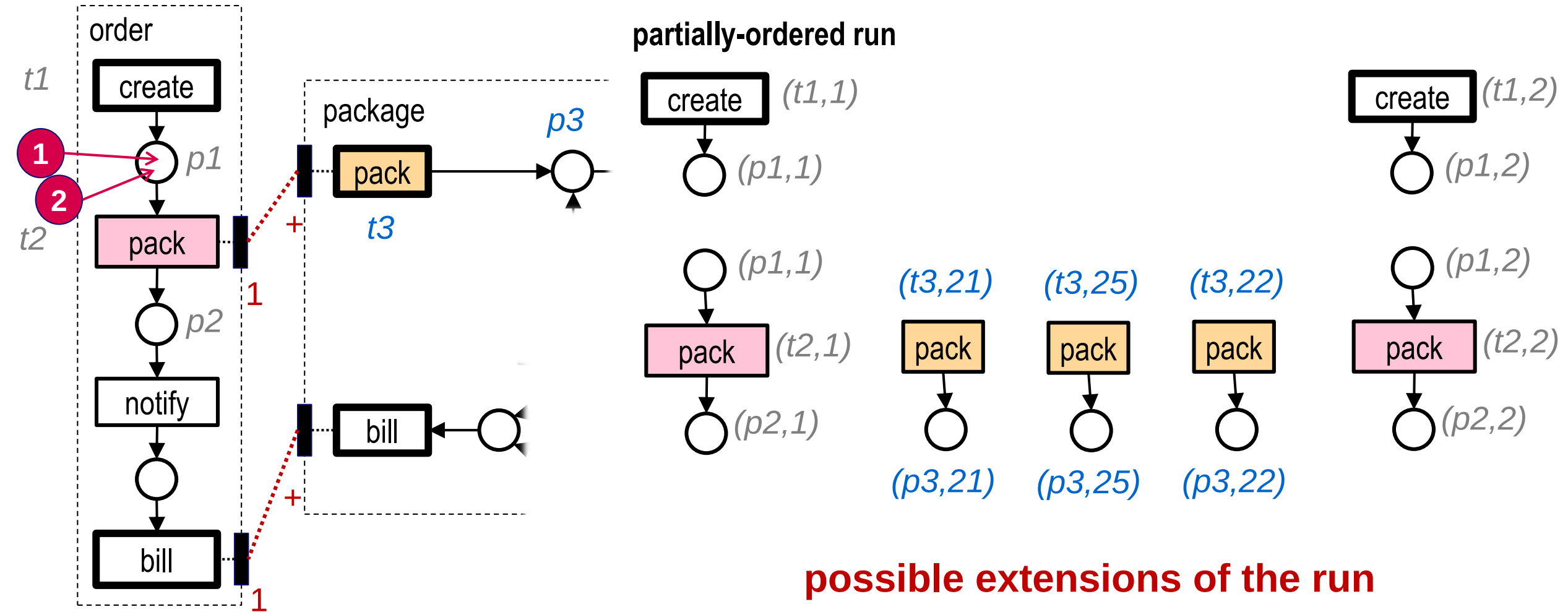
Different Instances: “own” local runs



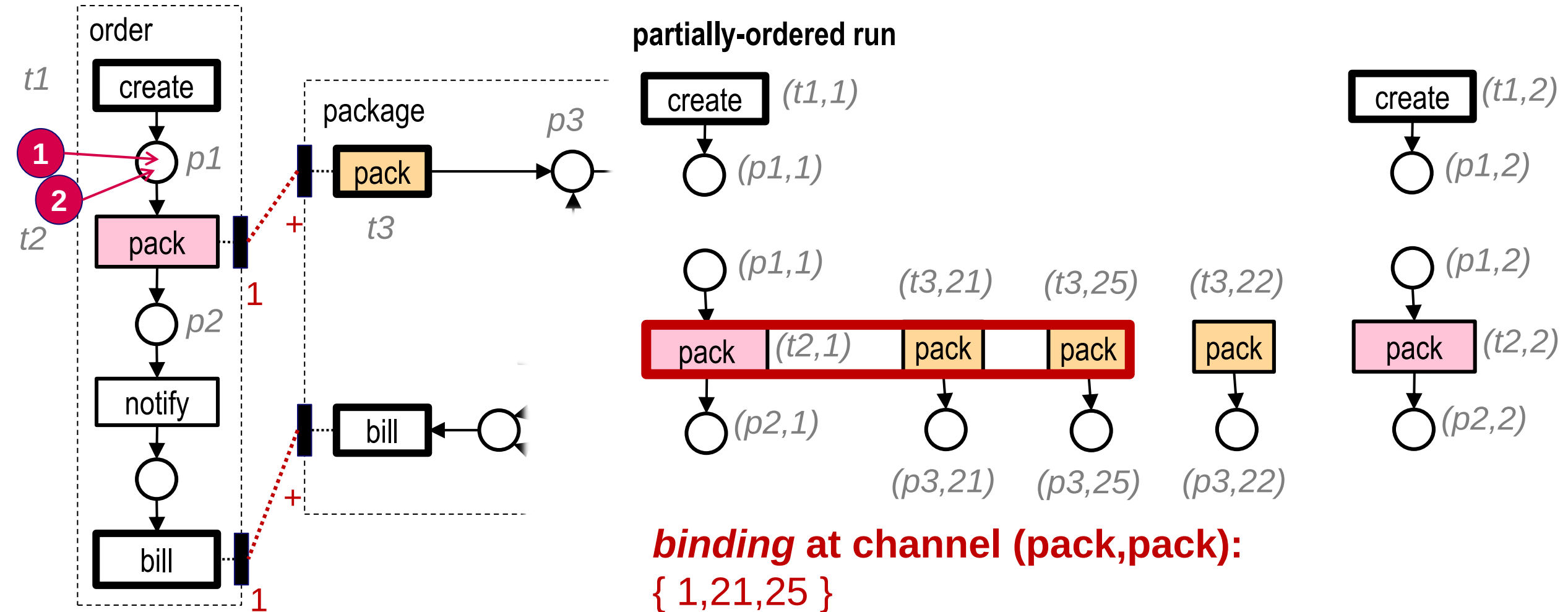
Different Instances: “own” local runs



How to synchronize instances?



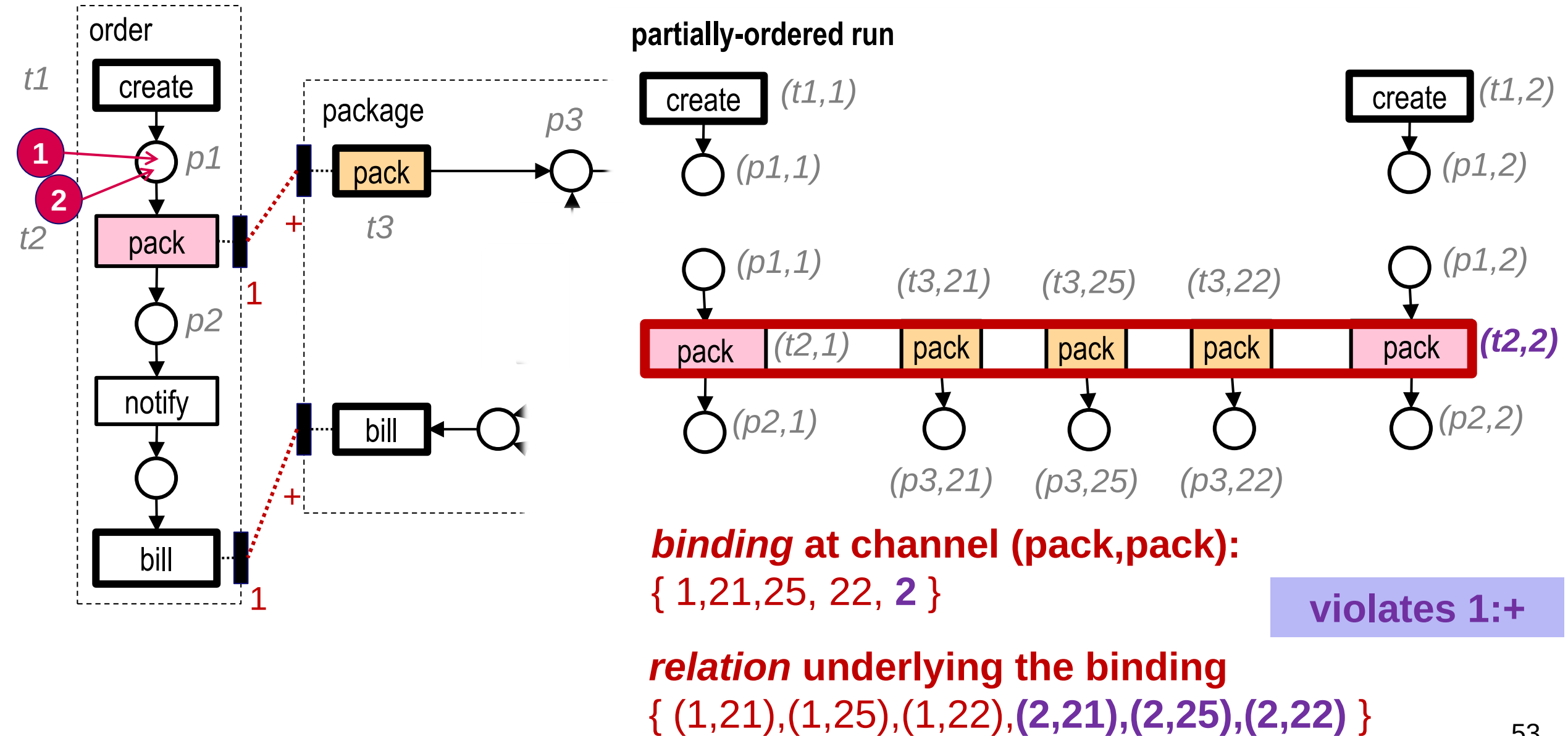
Binding = non-det. chosen set of ids to sync



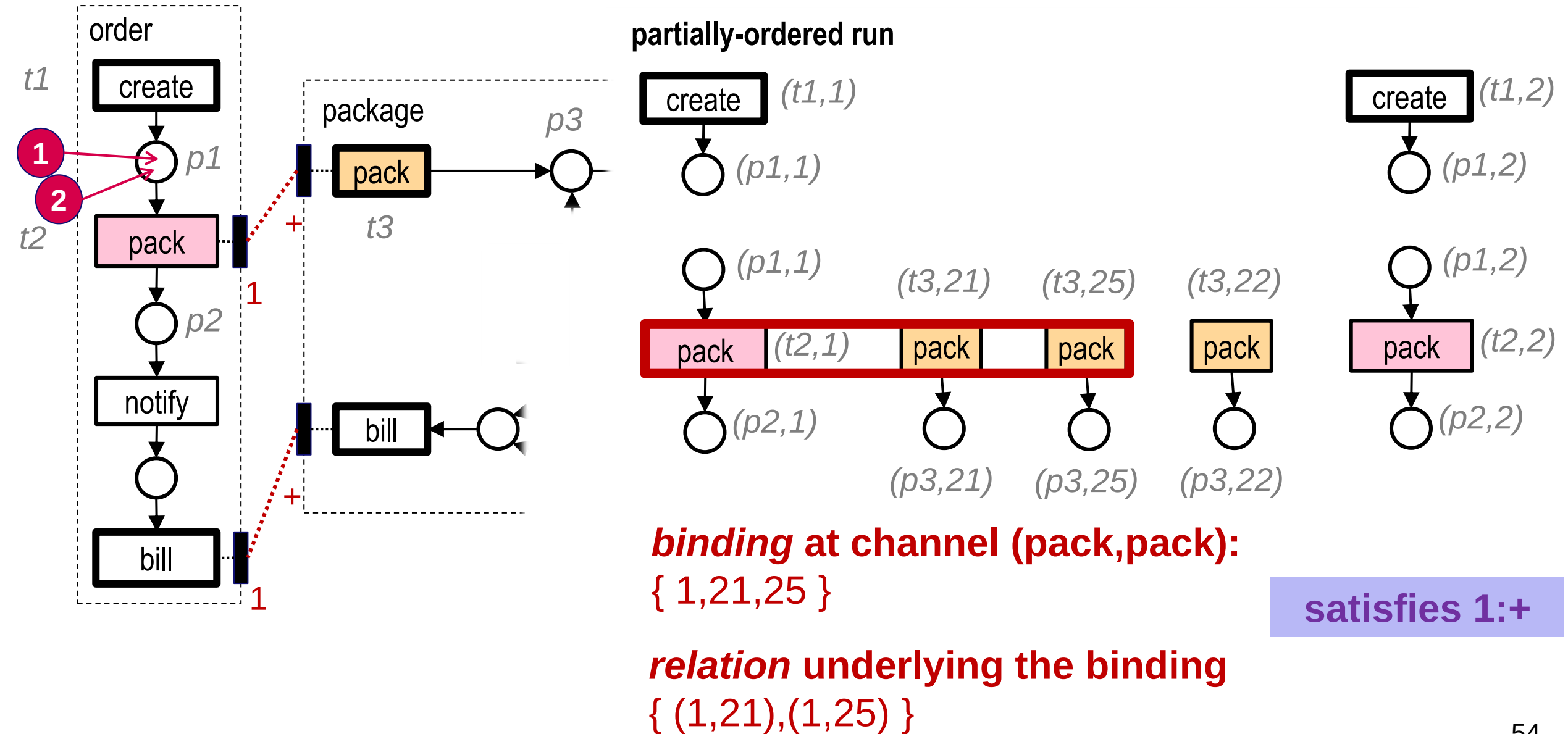
binding at channel (pack,pack):
 $\{ 1,21,25 \}$

relation underlying the binding
 $\{ (1,21),(1,25) \}$

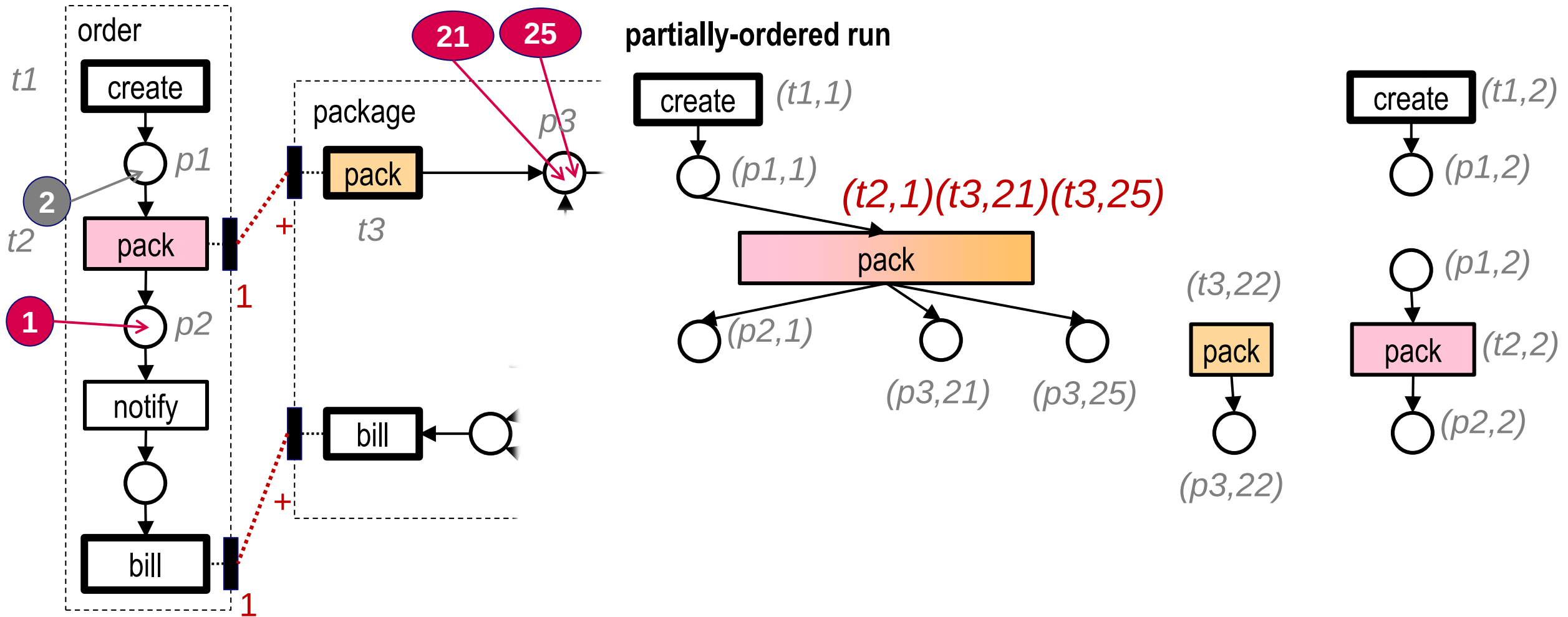
Binding = non-det. chosen set of ids to sync



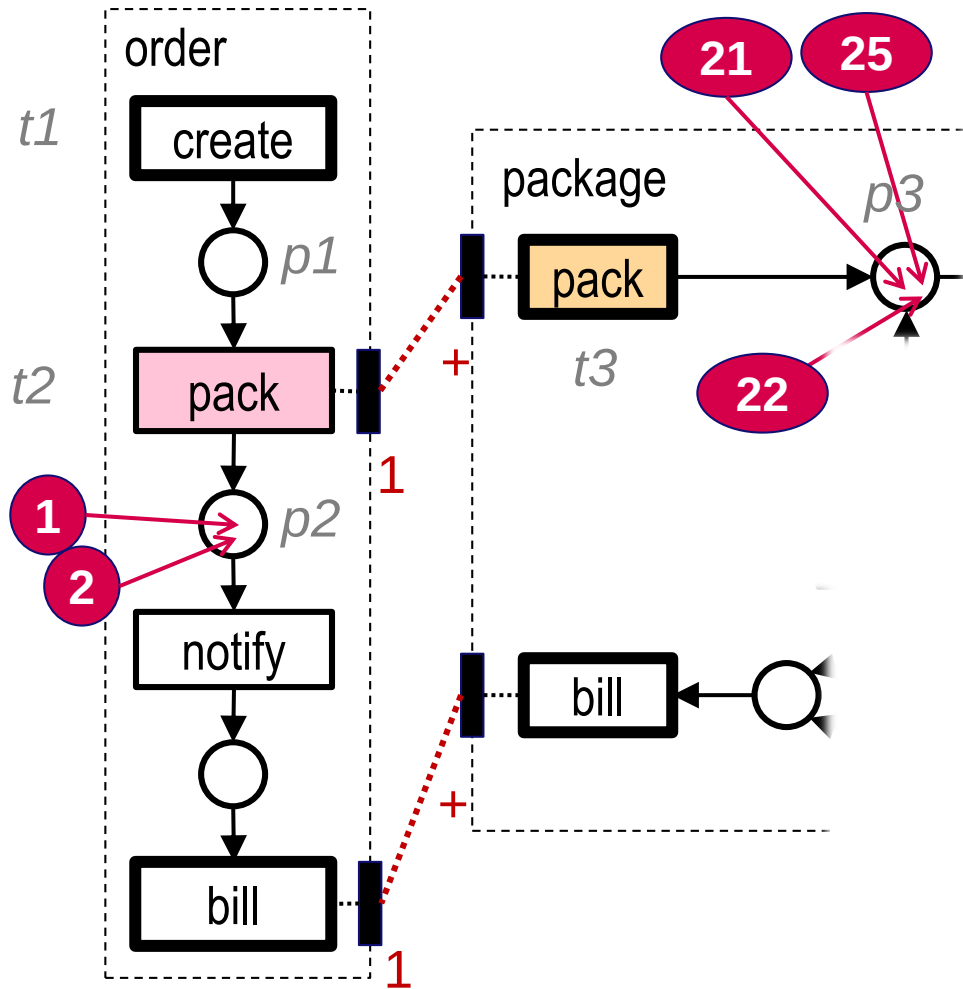
Binding = non-det. chosen set of ids to sync



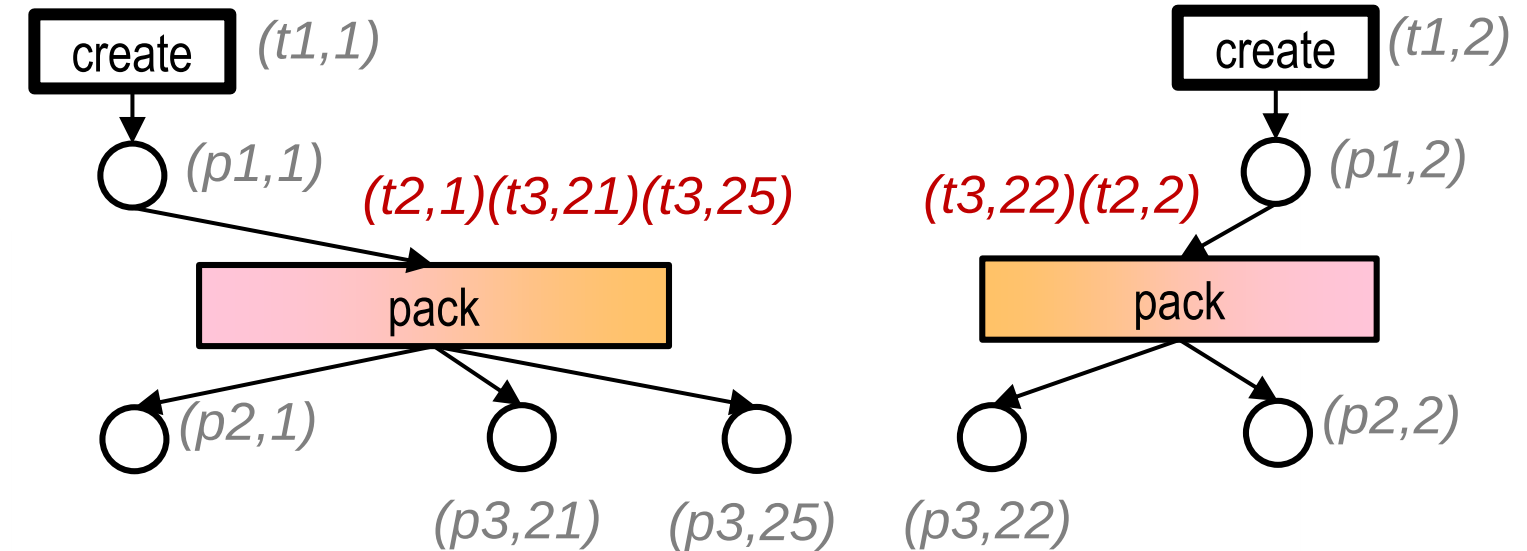
Unbounded synchronization of local events



Unbounded synchronization of local events

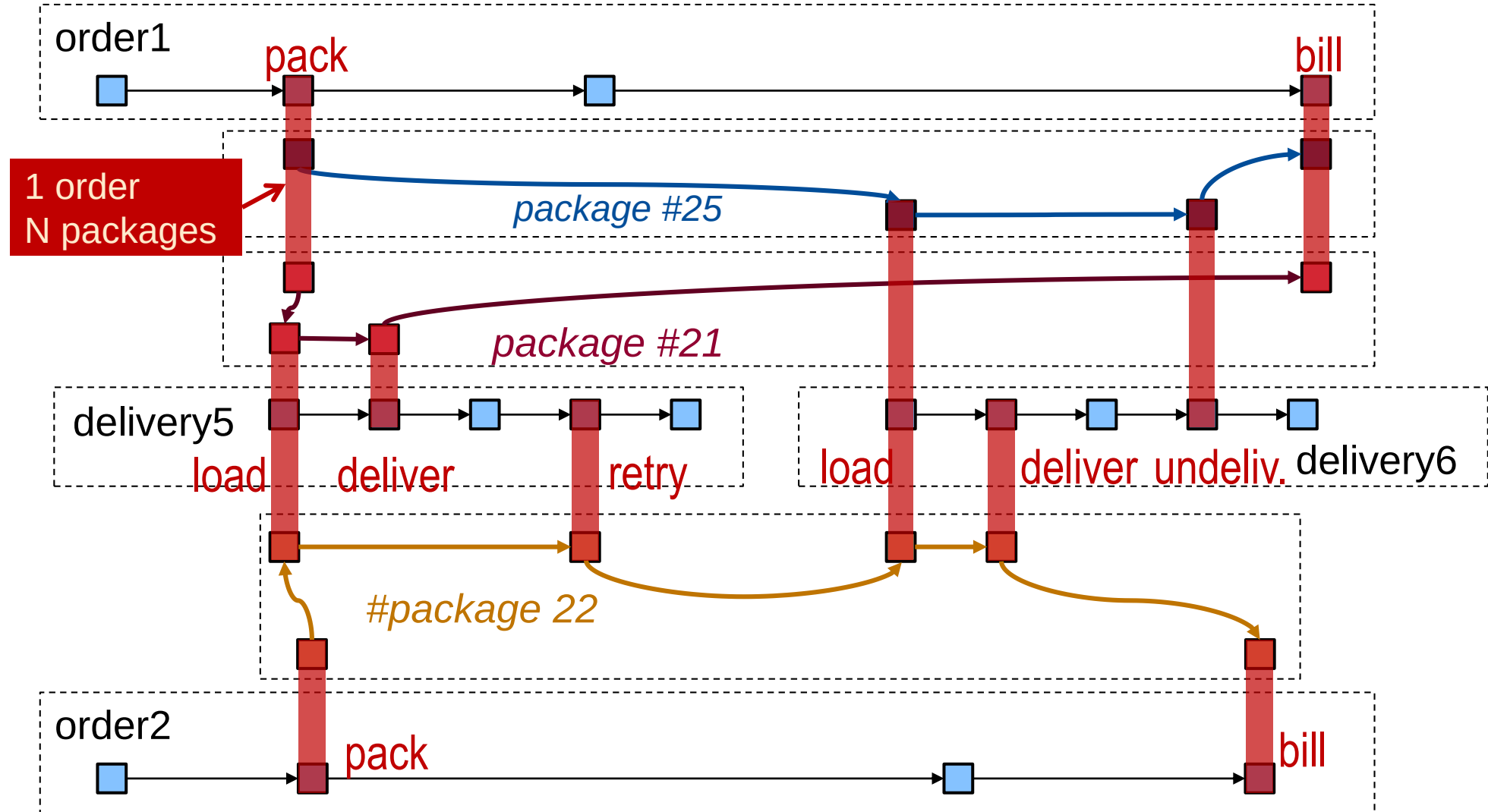


partially-ordered run

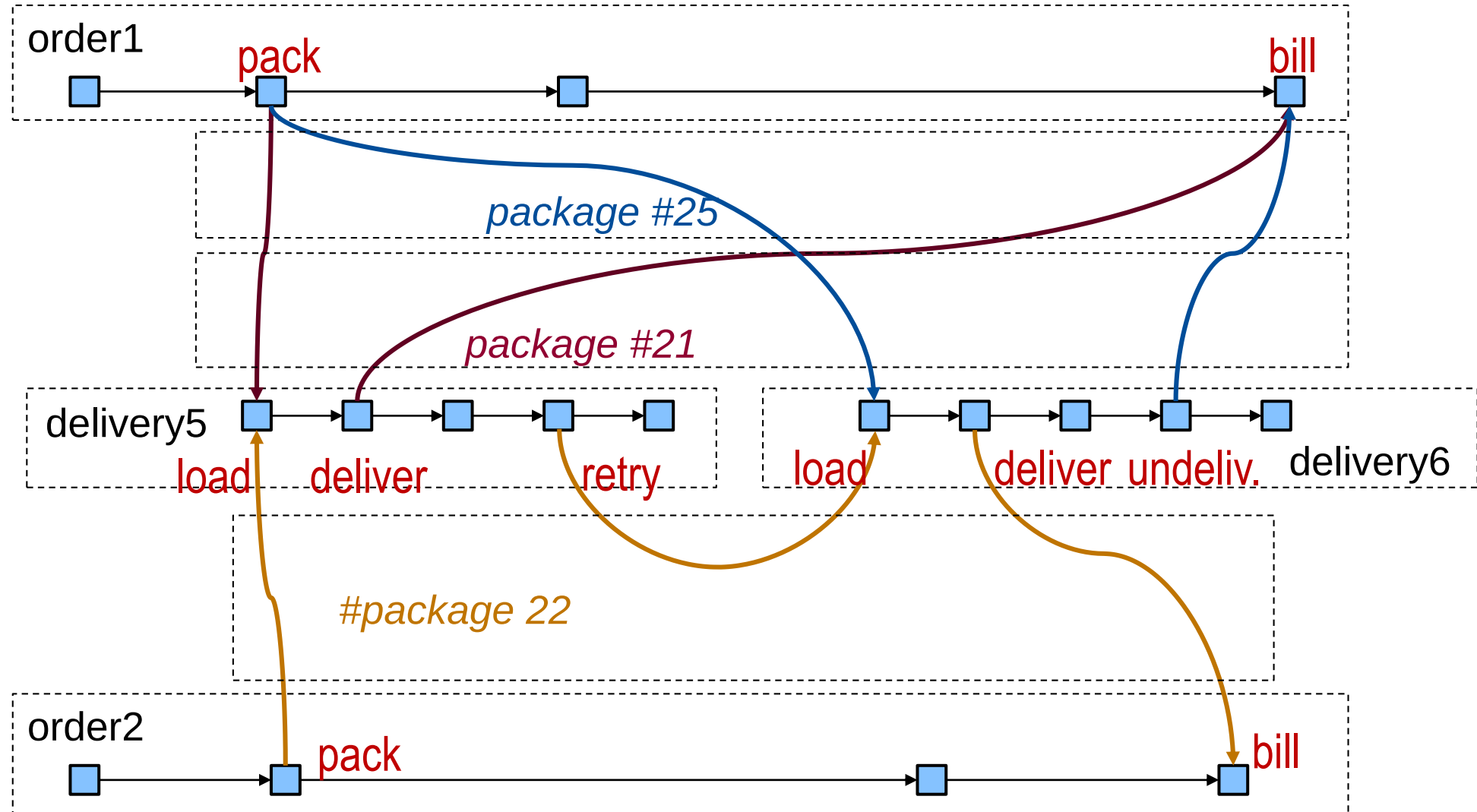


synchronization describes relation
on behavioral level, **no data stored!**

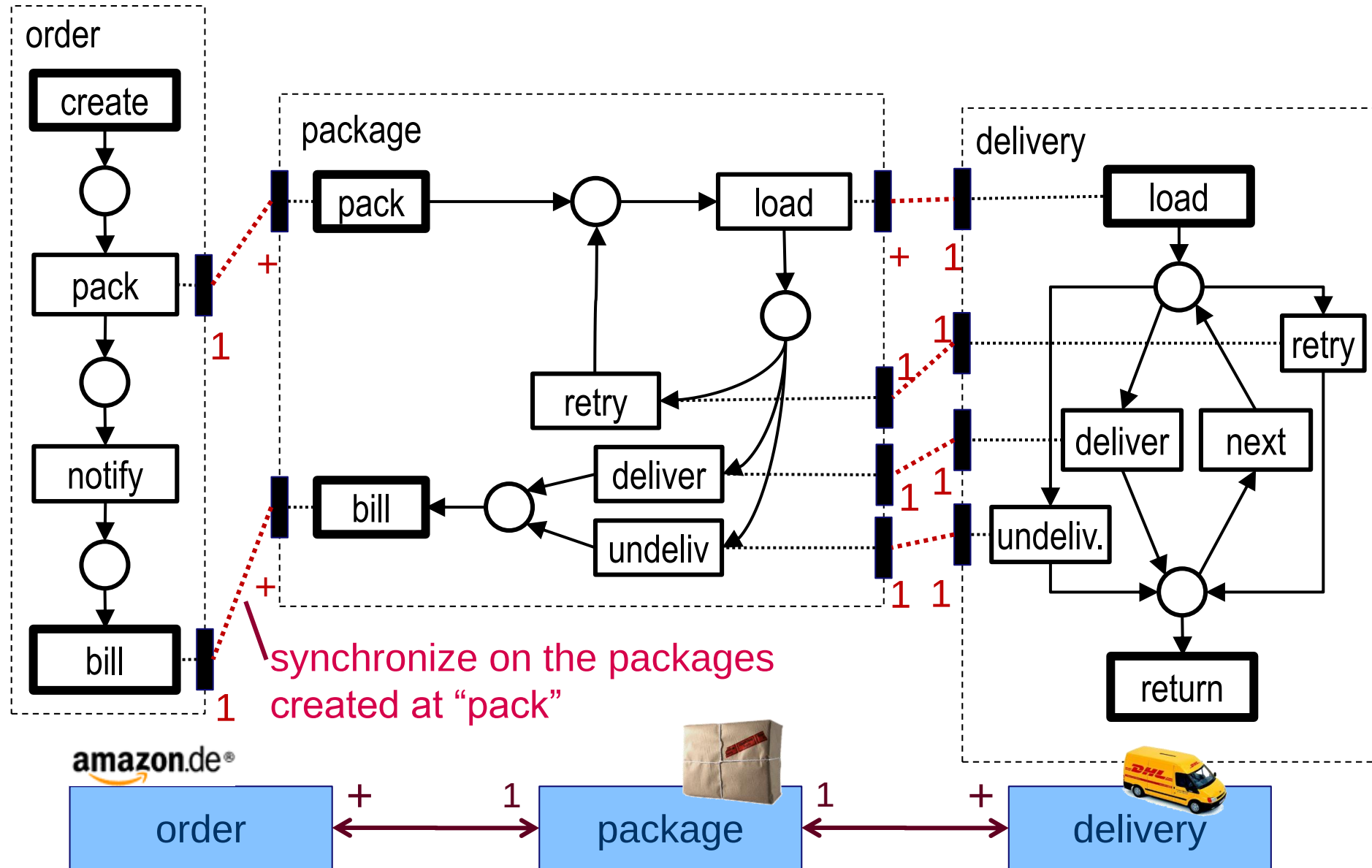
Each instance has 1 local run + synchronization



... compose into run with m:n interactions

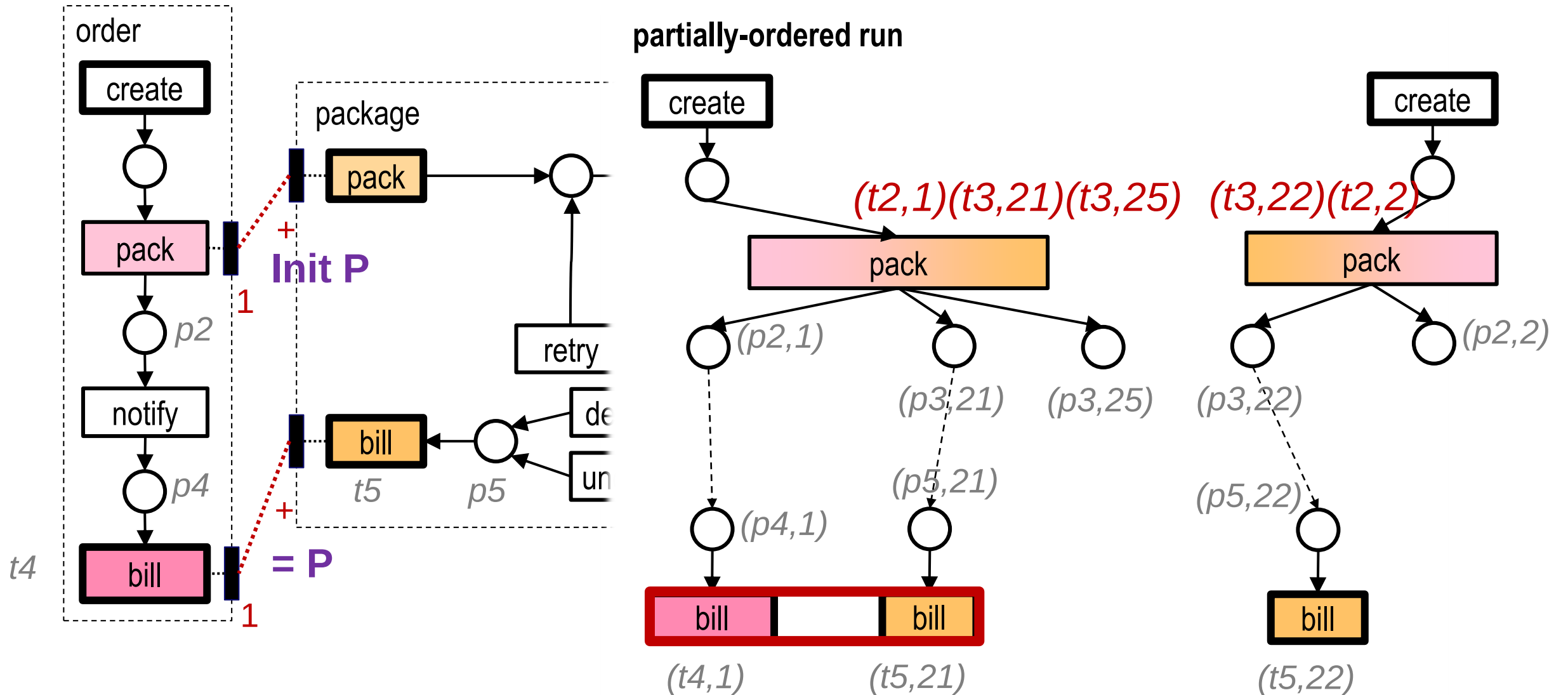


What's missing?



Initialize Correlation Binding P at “pack”

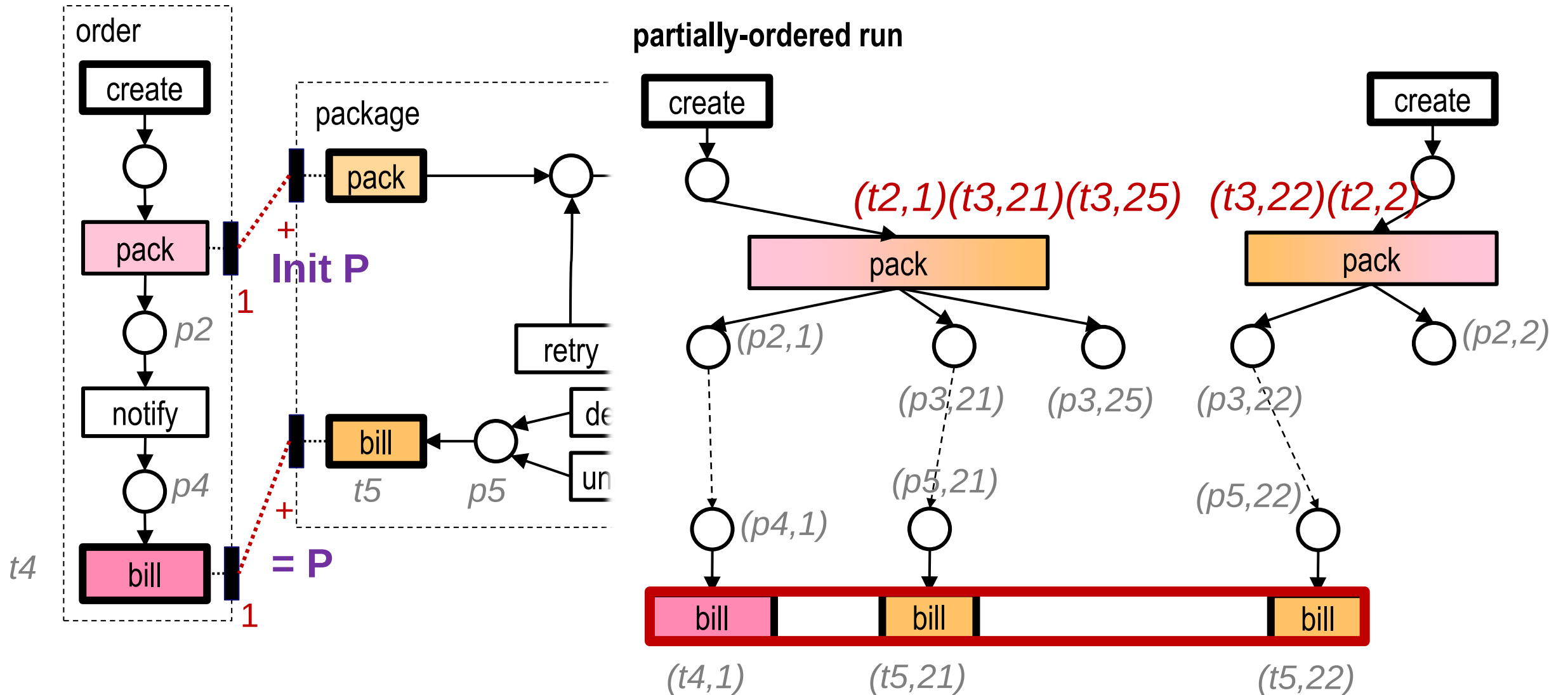
Match (=) Binding P at “bill”



Init (1,21),(1,25) ≠ Match (1,21)

Initialize Correlation Binding P at “pack”

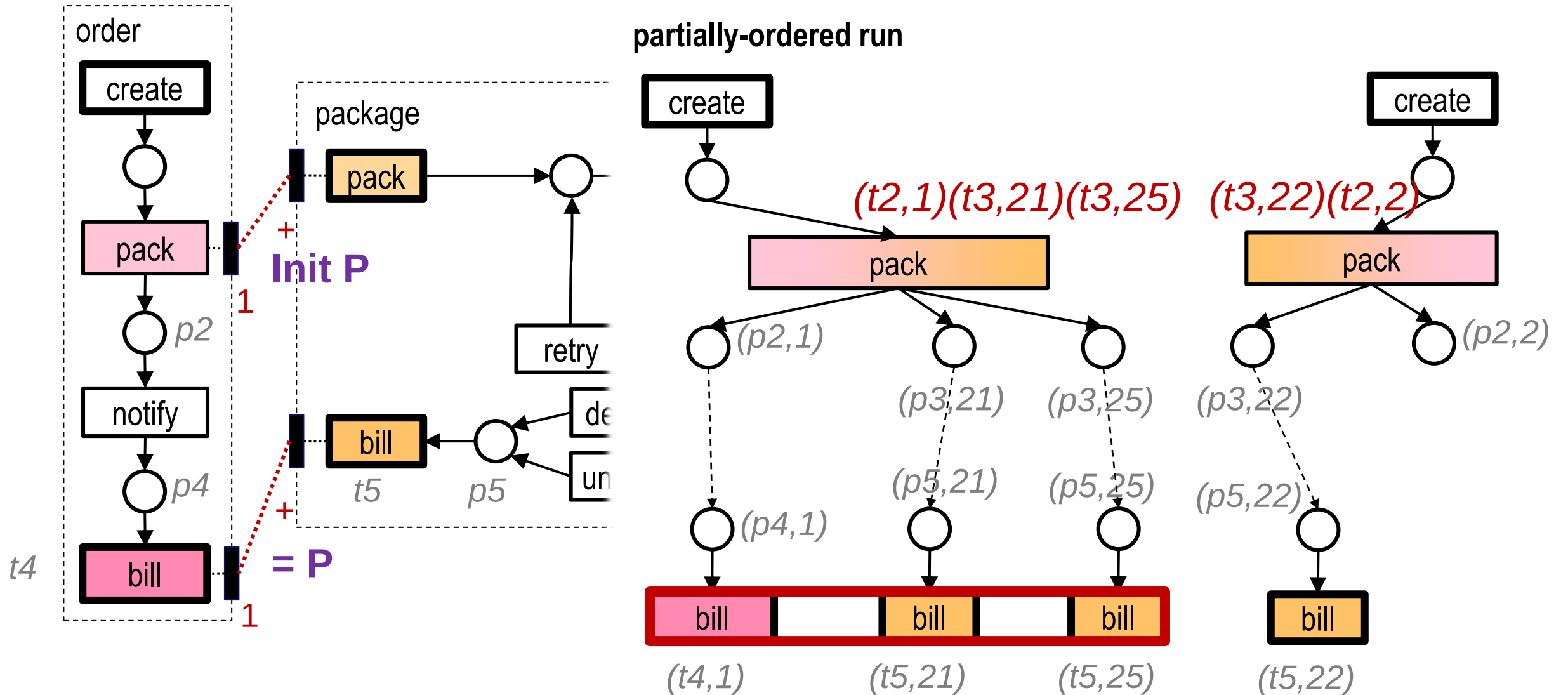
Match (=) Binding P at “bill”



Init (1,21),(1,25) ≠ Match (1,21),(1,22)

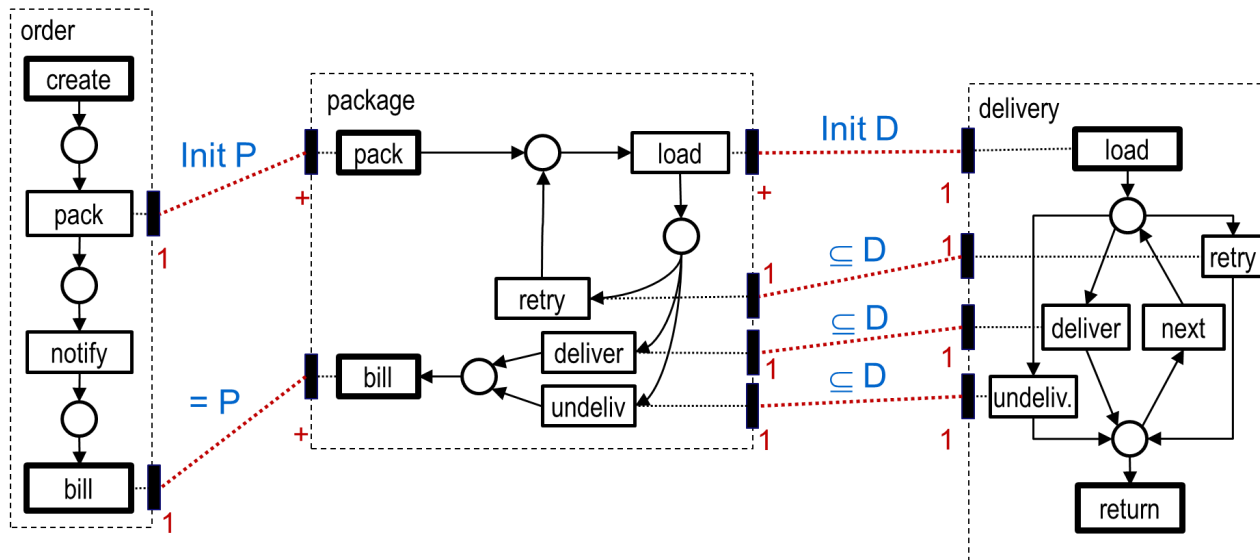
Initialize Correlation Binding P at “pack”

Match (=) Binding P at “bill”



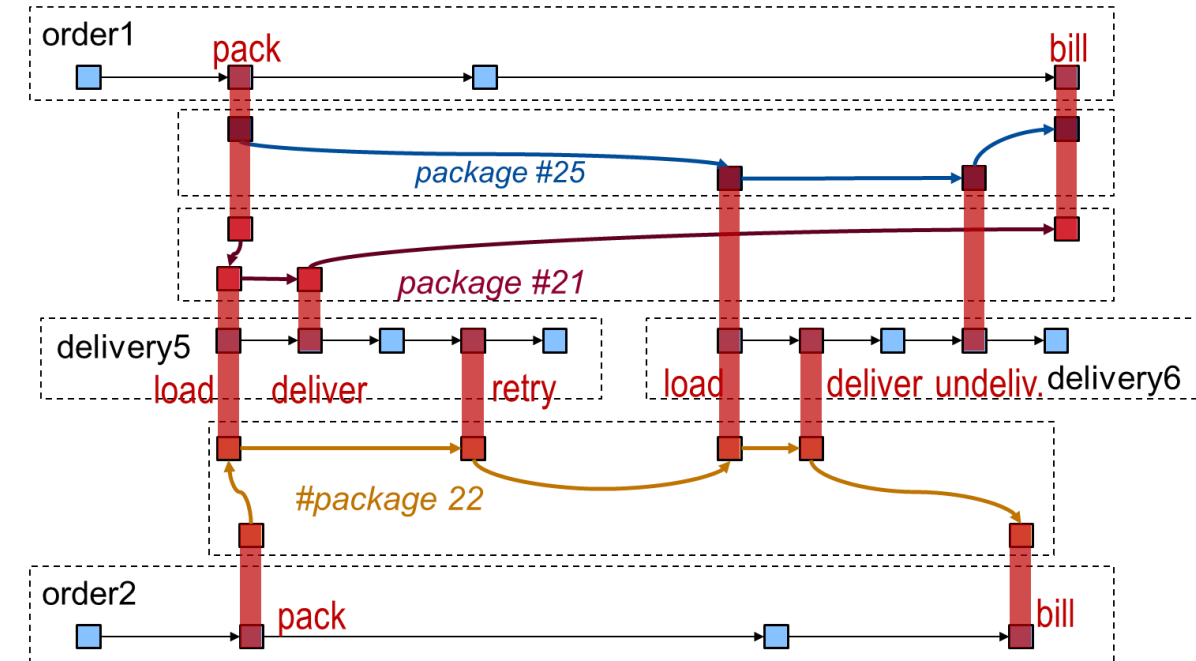
Init (1,21),(1,25) = Match (1,21),(1,25)

“Synchronous Proclets”



k process models

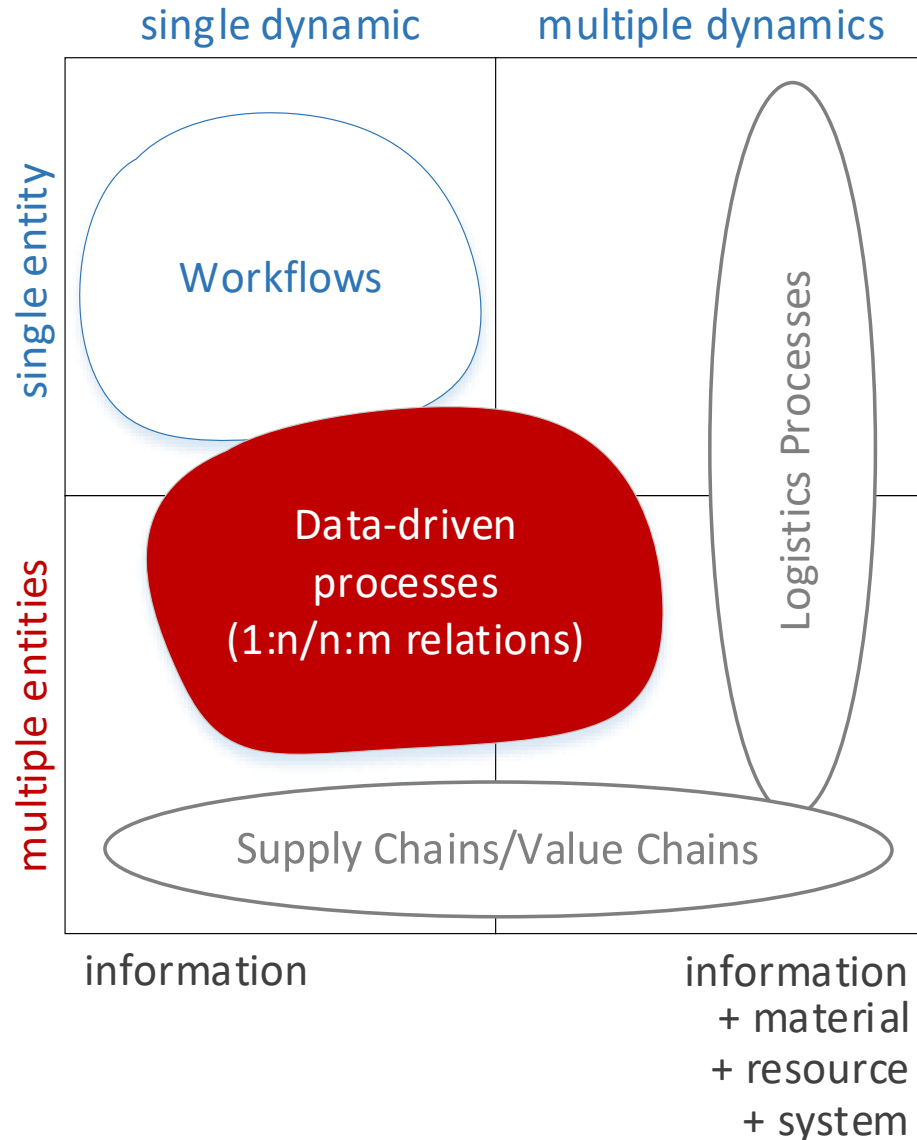
- Synchronous channels
- cardinality constraints 1:1, 1:n
- correlation constraints: $\text{Init } P$, $\subseteq P$, $= P$



operational semantics: PO-runs

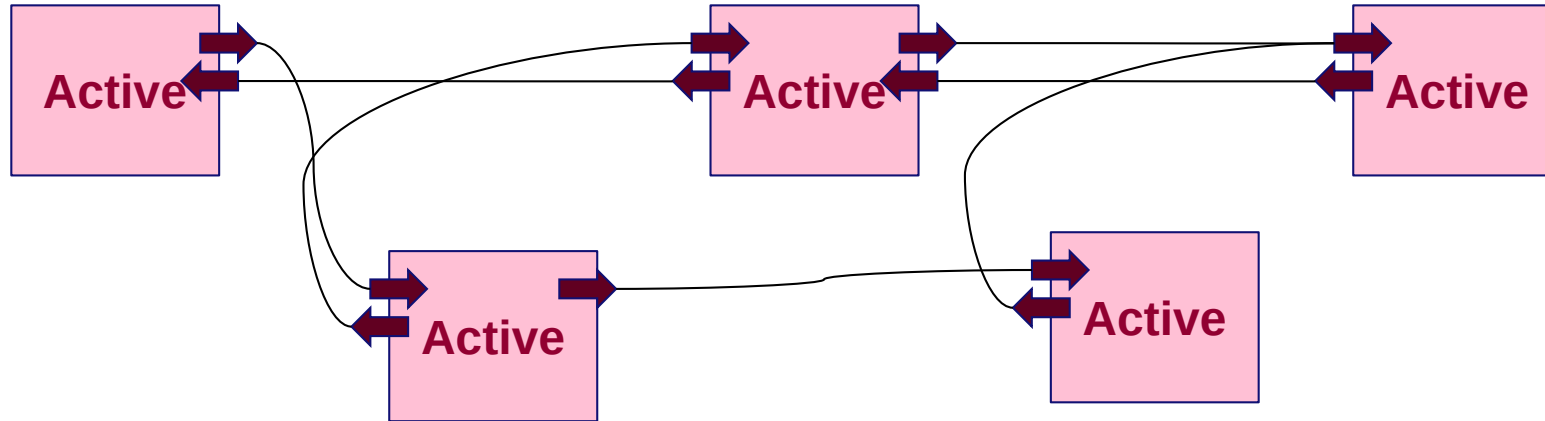
- id-tokens + ν -Petri net semantics
- unbounded synchronization of events
- events hold all relational information
- history-based correlation

Multi-Dimensional Processes



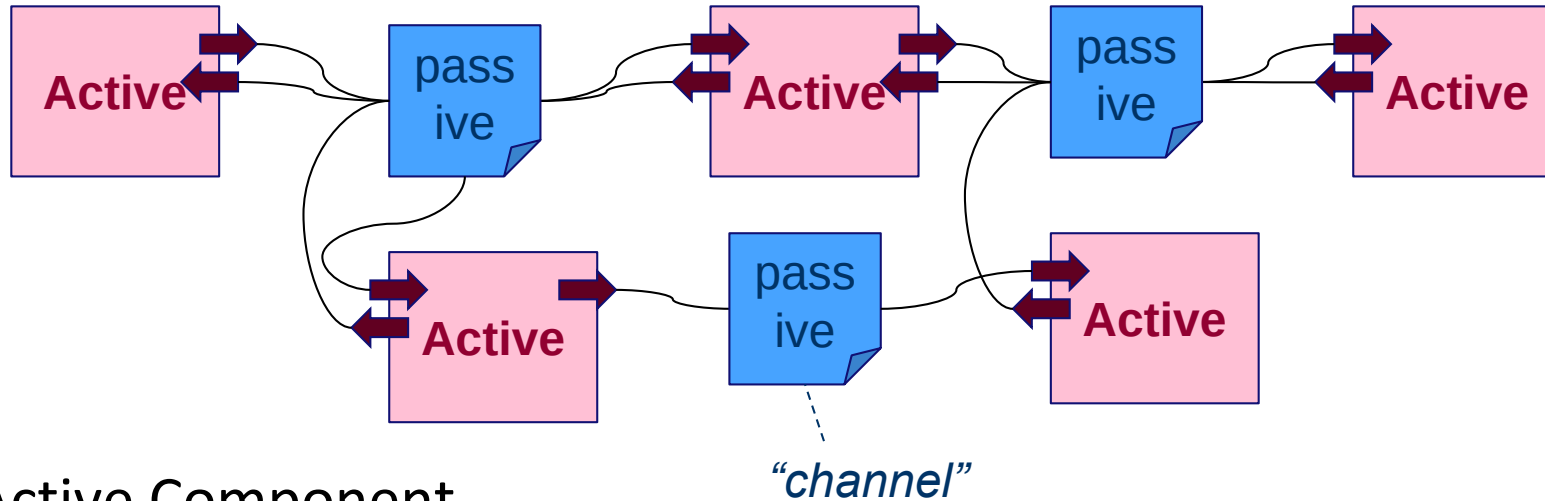
- Processes with multiple entities
 - How do they look like in practice?
 - Where does current modeling fail?
 - Implementation
 - Process mining
 - A proposal
 - **New research questions**

Active and Passive Components



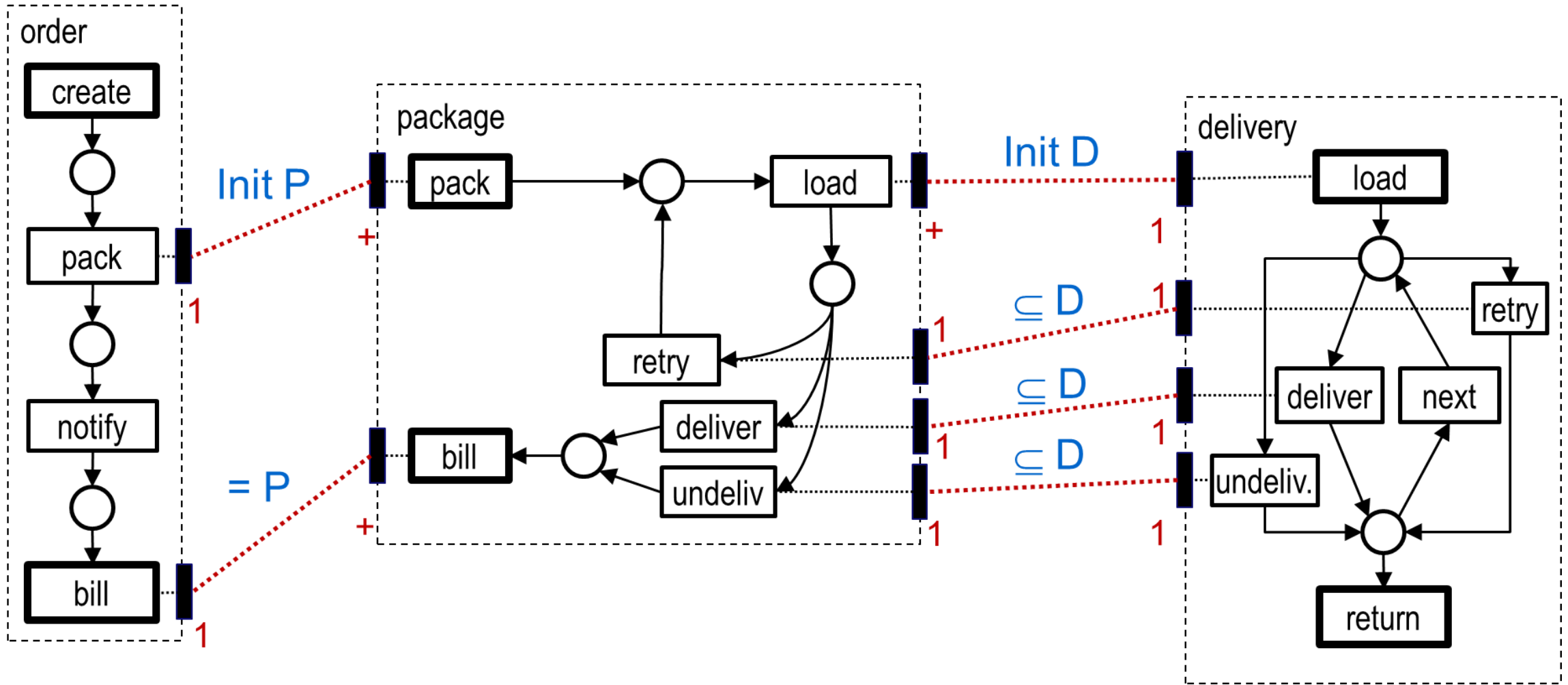
- Active Component
 - “service”: activities, performed by agents driving the process, e.g. split an order, write an invoice, ...
 - can communicate (asynchronously)

Active and Passive Components



- Active Component
 - “process”: activities, performed by agents driving the process, e.g. split an order, write an invoice, ...
 - can communicate (asynchronously)
- Passive Component
 - “data object”: attributes, can be updated, e.g. a package
 - order of updates is constrained, triggered from outside
 - **restricts interaction between several active processes**

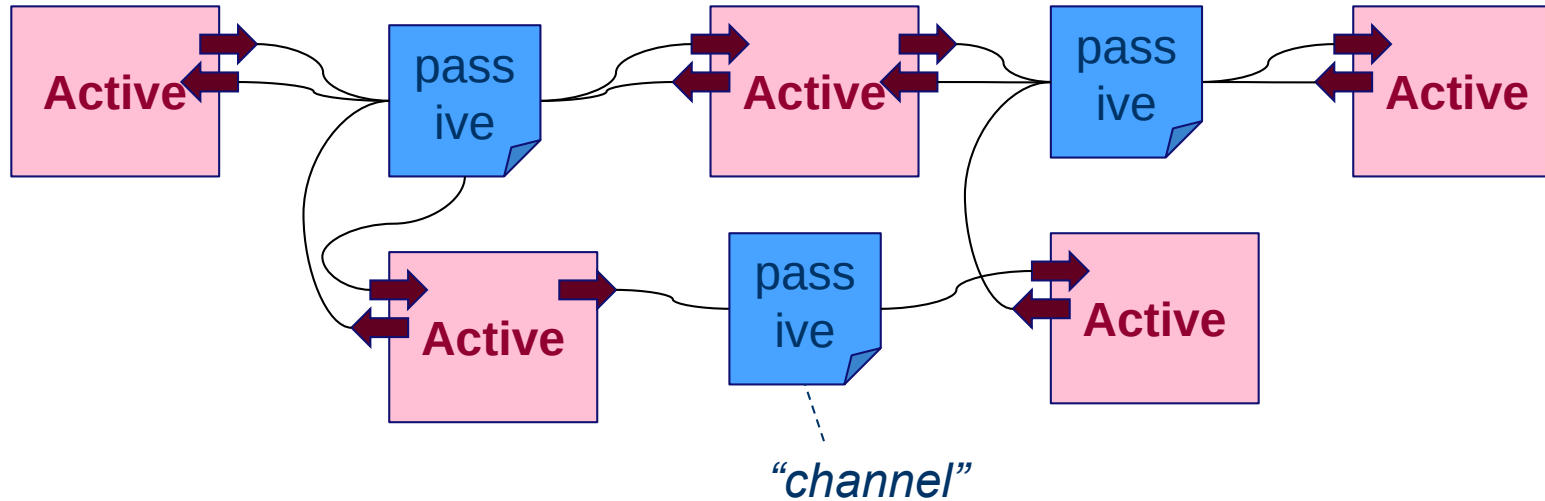
Is this model sound?



No, solution given in:

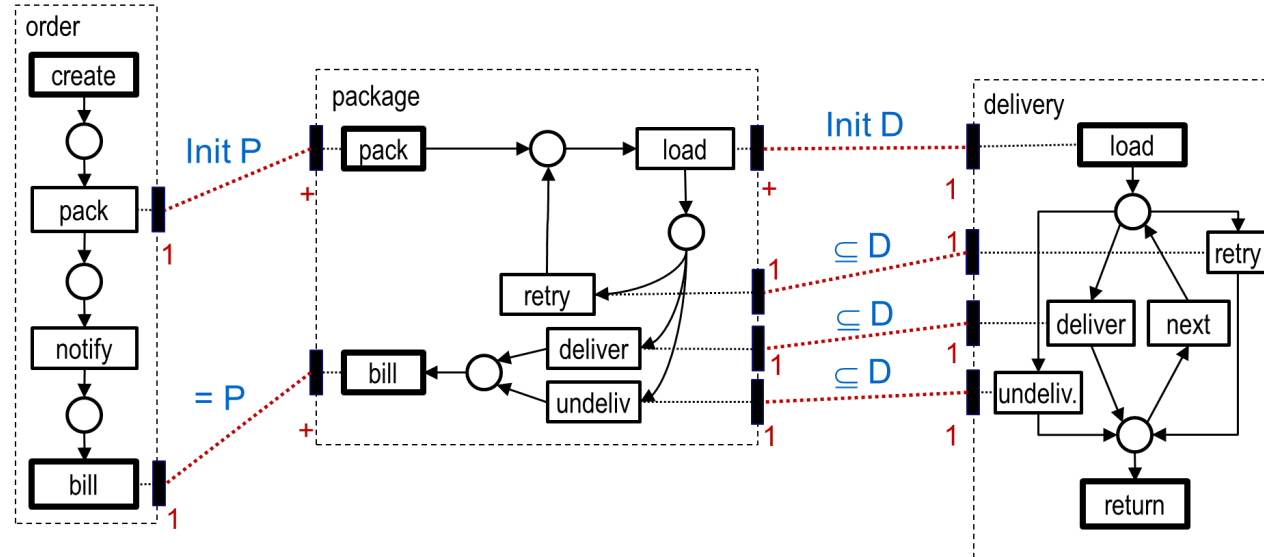
Dirk Fahland "Describing Behavior of Processes with Many-to-Many Interactions", Petri Nets 2019

New verification & synthesis problems



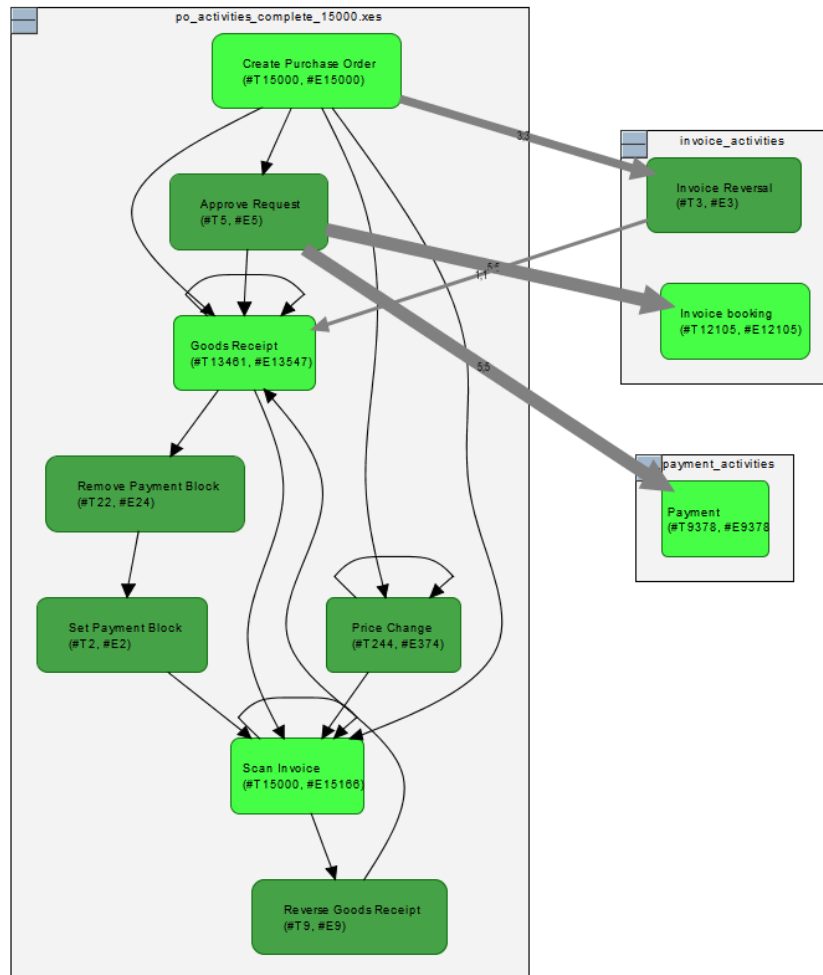
- Is reachability **decidable**?
- Is the model „sound“?
 - parameterized verification problem (for all number of instances)
- What's the **minimal number of instances** needed to achieve a particular (problematic) behavior?
- Given k „active“ components
 - **synthesize the „passive“ components** to ensure property X

New Modeling (Language) Problems

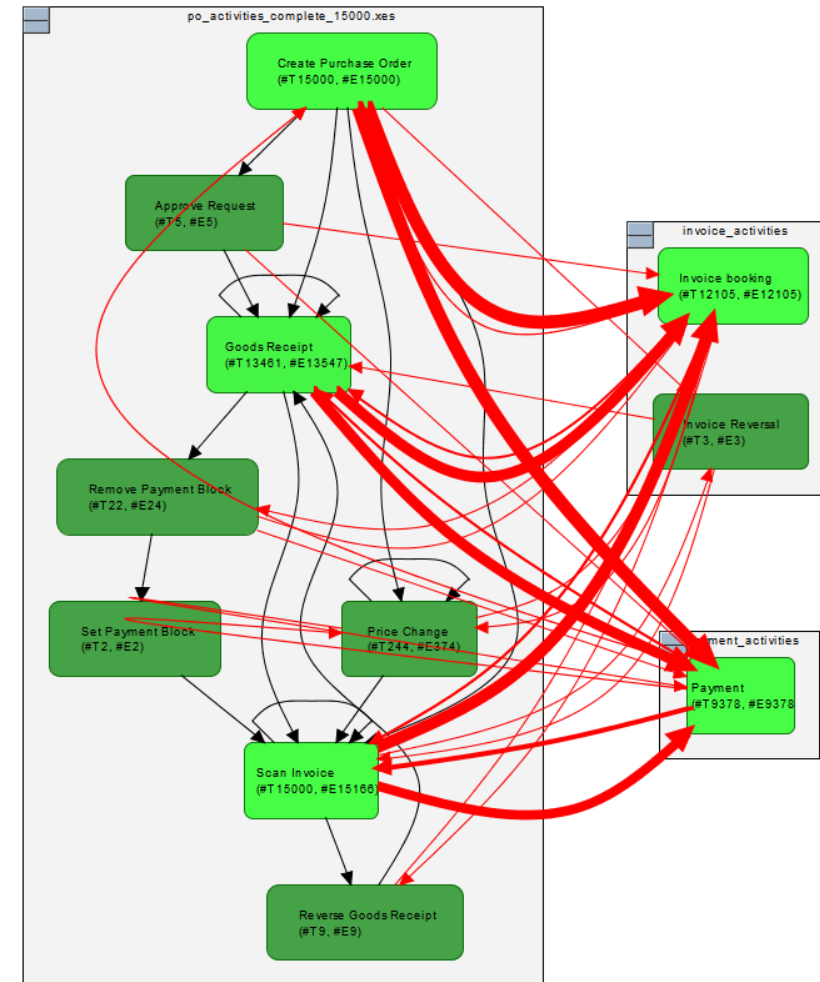


- How to add **determinism**, e.g., link to **data model**, **guard conditions**
 - Data-Centric Dynamic Systems, DB-Petri Nets (Marco Montali)
- What are **adequate design patterns**?
- How to design **comprehensible models** (for task X)?
 - These models flatten the 1:n/n:m interactions
 - Strong “visual” discrepancy between model syntax and behavior

Problem: Flattened n:m relations & variants

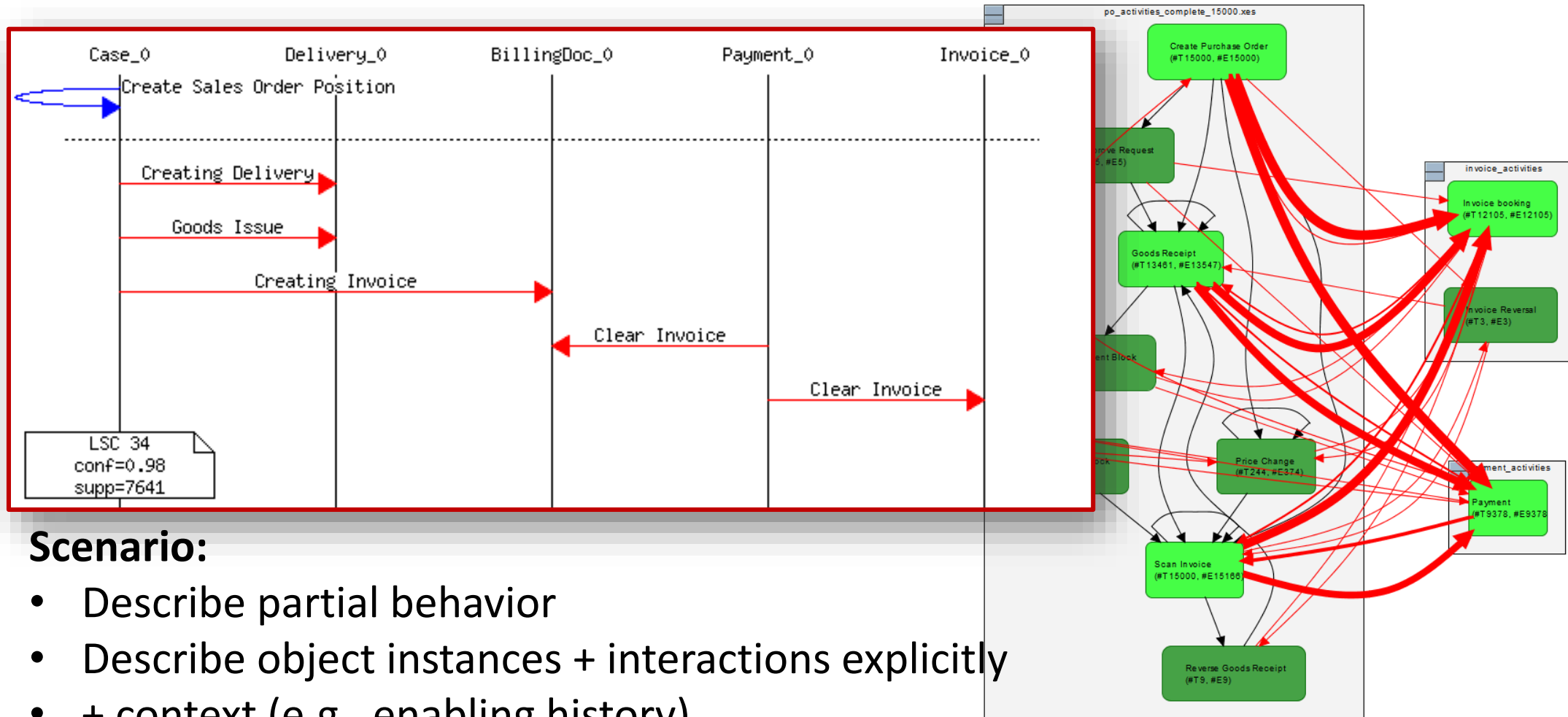


most frequent behavior



all behaviors across 3 data objects

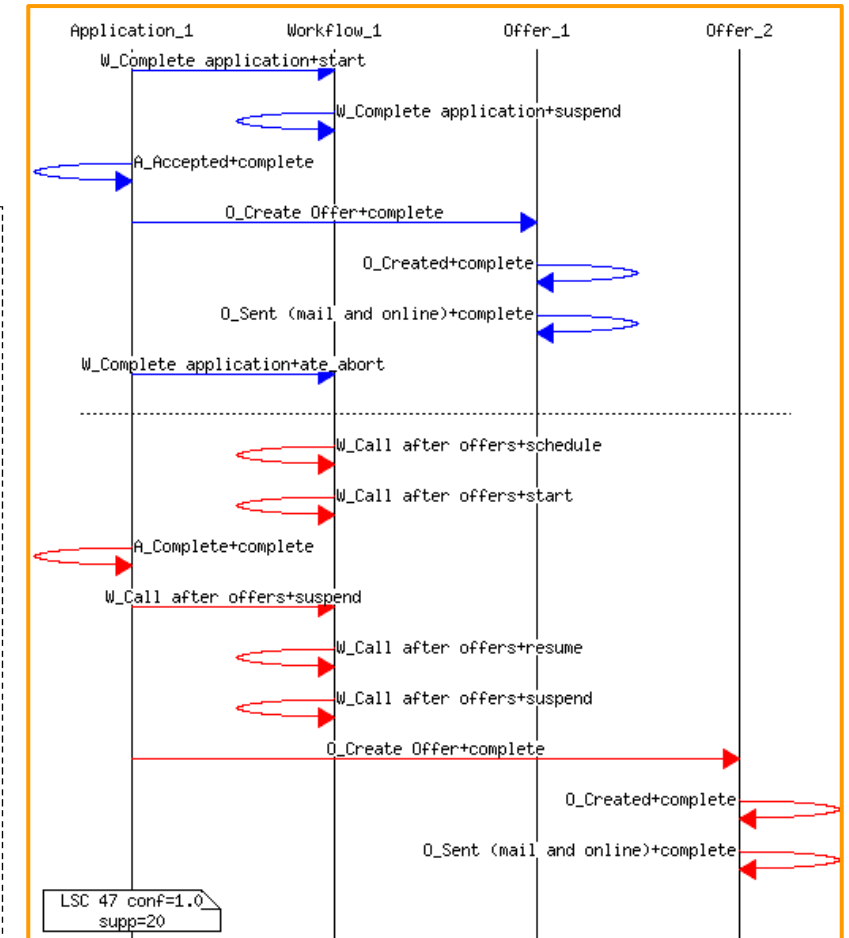
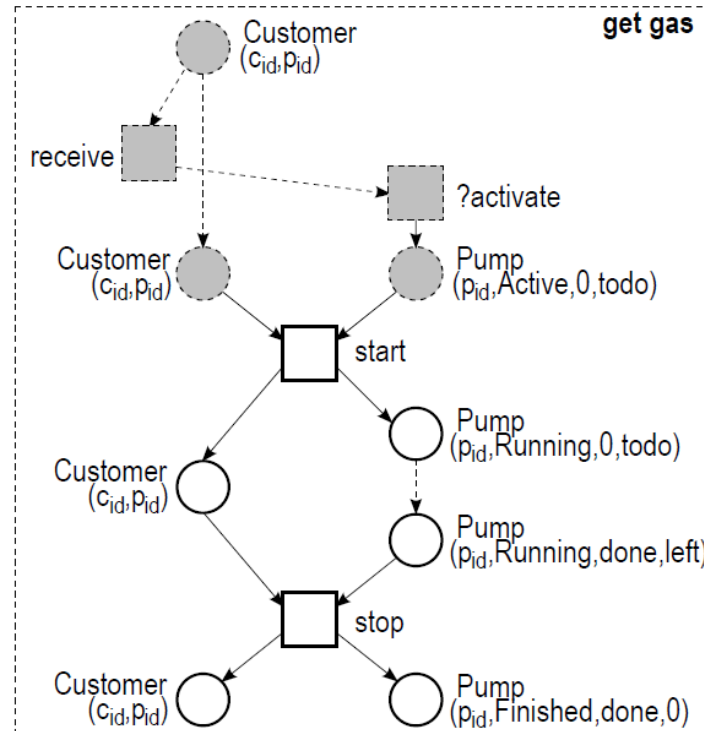
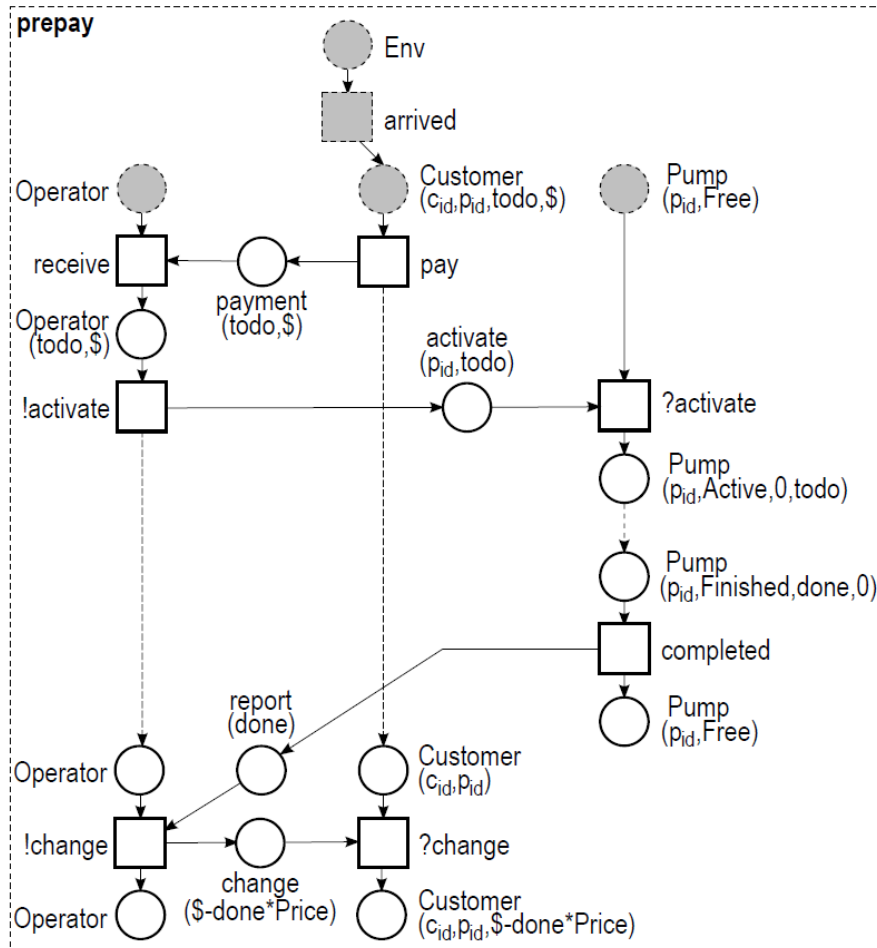
Explicitly describing behavior over n:m relations



Scenario:

- Describe partial behavior
- Describe object instances + interactions explicitly
- + context (e.g., enabling history)

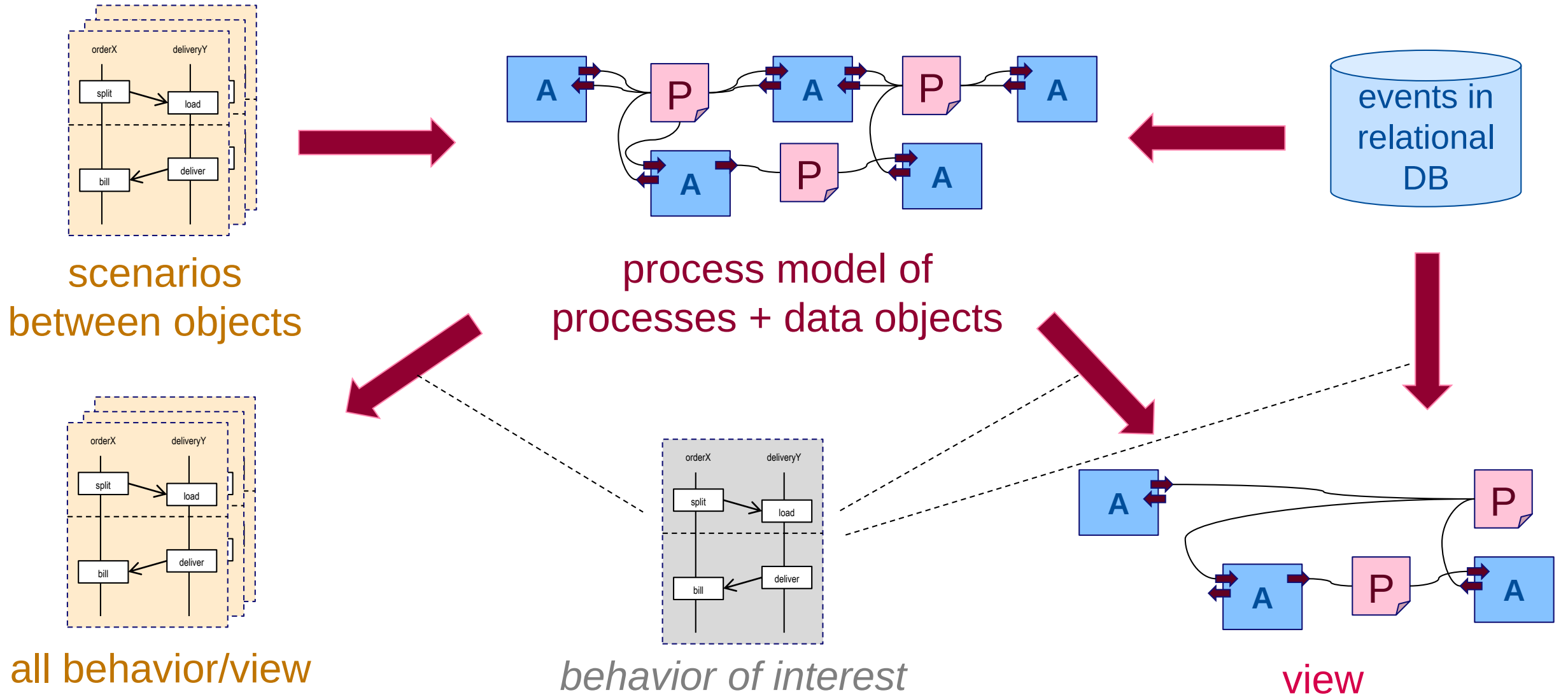
Scenarios w/ history specify m:n interactions in a visual, comprehensive way



Dirk Fahland "Oclets - Scenario-Based Modeling with Petri Nets." Petri Nets 2009: 223-242

Dirk Fahland, Robert Prüfer: Data and Abstraction for Scenario-Based Modeling with Petri Nets. Petri Nets 2012: 168-187

Need to transform between local/global views



Wrap-Up

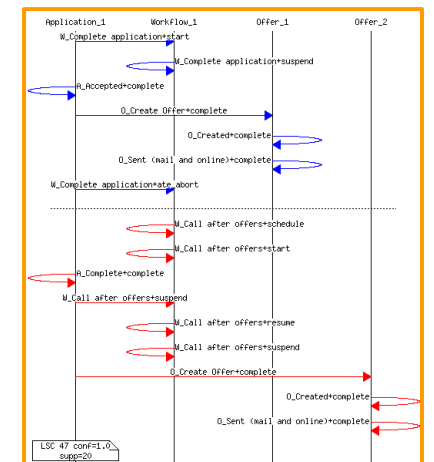
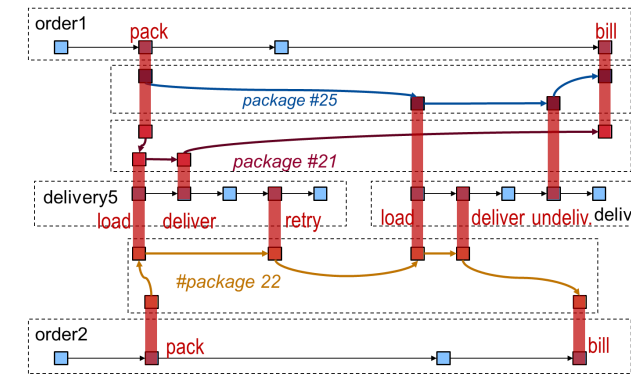
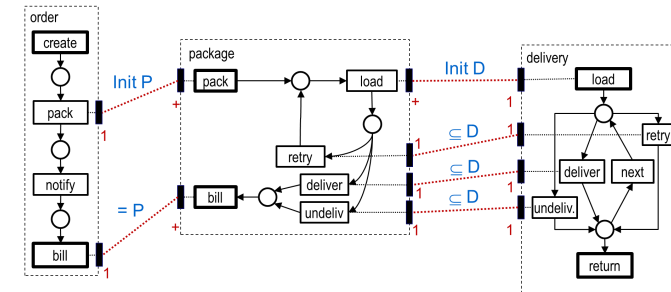
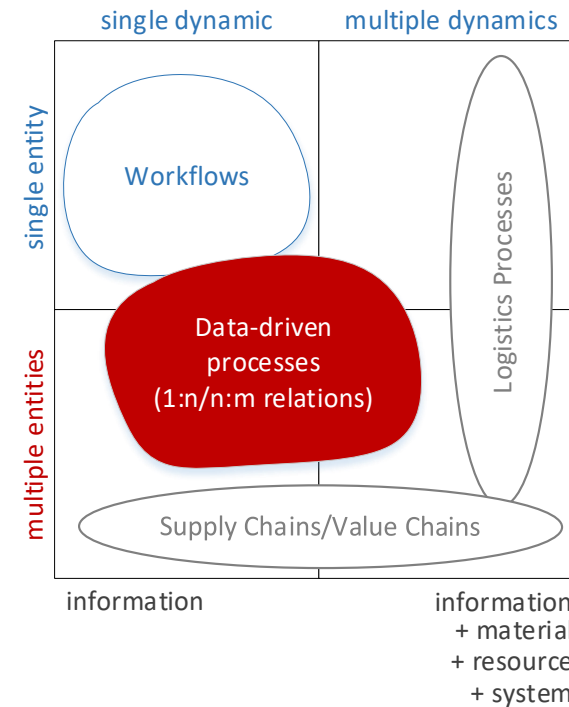
■ Multi-Dimensional Process Dynamics

■ Net-based model

- partially ordered runs
- Id-tokens
- Unbounded synchronization at events
- History-based correlation

■ Gives rise to many new research questions

- Decidability, verification
- Scenario-based modeling w/ history
- Synthesis, querying



Reading

- Dirk Fahland, Massimiliano de Leoni, Boudewijn F. van Dongen, Wil M. P. van der Aalst:
“Many-to-Many: Some Observations on Interactions in Artifact Choreographies.” ZEUS 2011: 9-15
The running example of orders and deliveries, and the idea of synchronous interactions of artifacts with processes.
- Dirk Fahland **“Describing Behavior of Processes with Many-to-Many Interactions”**, Petri Nets 2019
- Dirk Fahland **“Oclets - Scenario-Based Modeling with Petri Nets.”** [Petri Nets 2009](#): 223-242
- Dirk Fahland, [Robert Prüfer](#): **Data and Abstraction for Scenario-Based Modeling with Petri Nets.** [Petri Nets 2012](#): 168-187
- W.M.P. van der Aalst, R.S. Mans, and N.C. Russell. **“Workflow Support Using Proclets: Divide Interact, and Conquer.”** IEEE Data Eng. Bull., 32(3):16-22, 2009
- A. Nigam and N. Caswell, **“Business artifacts: An approach to operational specification,”** IBM Systems Journal, vol. 42, no. 3, pp. 428–445, 2003.
- D. Cohn and R. Hull, **“Business artifacts: A data-centric approach to modeling business operations and processes”** Bulletin of the IEEE Computer Society Technical Committee on Data Engineering, vol. 32, no. 3, pp. 3–9, 2009
- ACSI Project **“The core ACSI artifact paradigm: artifact-layer and realization-layer”**
http://www.acsi-project.eu/deliverables/D1.1_The_core_ACSI_artifact_paradigm.pdf
Different models for Artifact-Centric Processes (FSM, GSM, Proclets)
- E. Nooijen, B. v. Dongen, and D. Fahland, **“Automatic Discovery of Data-Centric and Artifact-Centric Processes,”** in Business Process Management Workshops. Springer, 2013, pp. 316–327.
Discovering Petri net life-cycle models from databases
- Viara Popova, Dirk Fahland, Marlon Dumas: **“Artifact Lifecycle Discovery.”** Int. J. Cooperative Inf. Syst. 24(1) (2015)
Discovering GSM models from raw logs
- Xixi Lu, Marijn Nagelkerke, Dirk Fahland: **“Discovering Interacting Artifacts from ERP systems”** IEEE Trans. On Services Computing (to appear),
<http://dx.doi.org/10.1109/TSC.2015.2474358>
Discovering Proclet models with interactions from databases
- Andreas Meyer, Luise Pufahl, Kimon Batoulis, Dirk Fahland, Mathias Weske: **“Automating data exchange in process choreographies”**. Inf. Syst. 53: 296-329 (2015)
Extending BPMN data objects with annotations to automated data dependencies, message creation, message correlation, message processing