



Automated Reasoning for Situational Awareness

Peter Baumgartner, Alexander Krumpholz

Supply Chain Integrity Digital Mission

www.data61.csiro.au

Situational Awareness - Systems of Interest

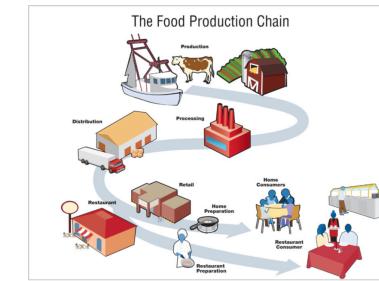
- **Factory Floor**

- Are the operations carried out according to the schedule?



- **Food Supply Chain**

- Are goods delivered within 3 hours and stored below 25°C?
 - Why is the truck late?
 - Where did the strawberries/honey come from?



- **Data Cleansing**

- Does the database have complete, correct, accurate and relevant data?

Situational Awareness - Systems of Interest

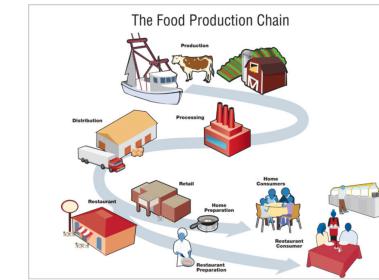
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Build a system that automatically derives such analysis?

Situational Awareness - Systems of Interest

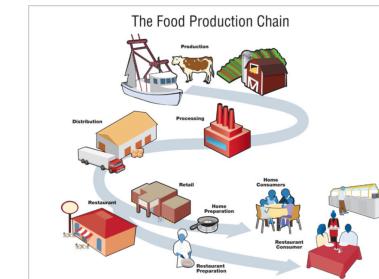
- **Factory Floor**

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- **Food Supply Chain**

- Are goods delivered within 3 hours and stored below 25°C?



- Why is the truck late?

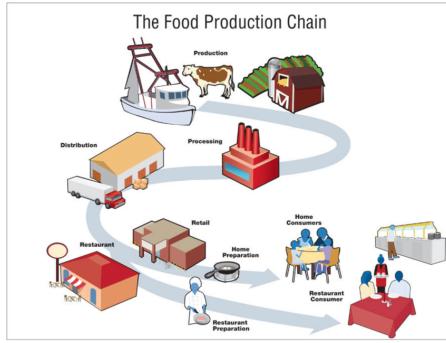
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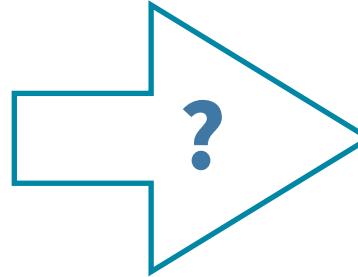
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Automated Reasoning for Situational Awareness



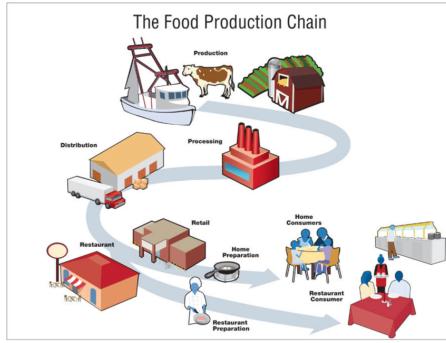
Events...

GPS coordinates
Temp sensor
Paperwork
Log DB



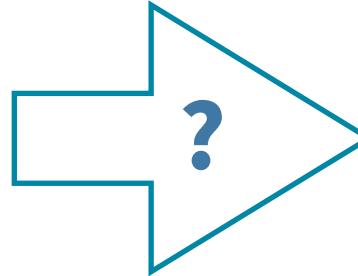
*Why is the truck late?
Are the tomatoes still fresh?*

Automated Reasoning for Situational Awareness



Events...

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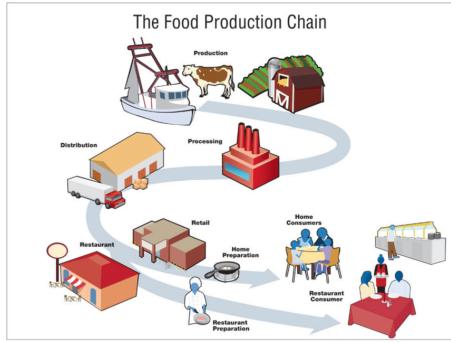


*Why is the truck late?
Are the tomatoes still fresh?*

Why this is hard

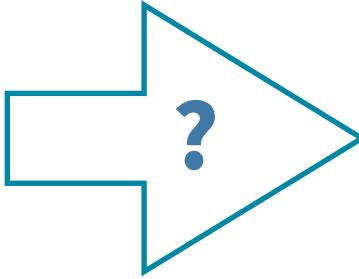
- Incomplete/noisy/erroneous data
- Need domain knowledge (“fresh”?)

Automated Reasoning for Situational Awareness



Events...

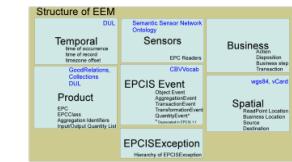
GPS coordinates
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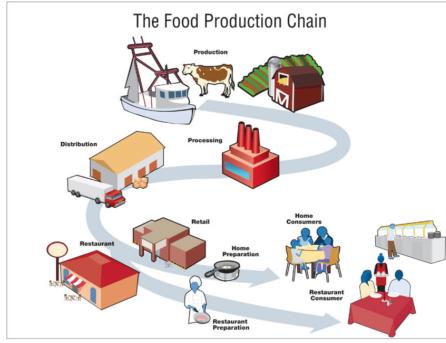
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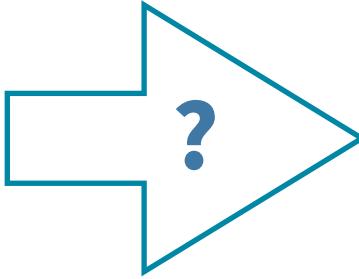


Automated Reasoning for Situational Awareness



Events...

GPS coordinates
Temp sensor
Paperwork
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*Why is the truck late?
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Why this is hard

- Incomplete/noisy/erroneous data
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Our *logic-based* approach

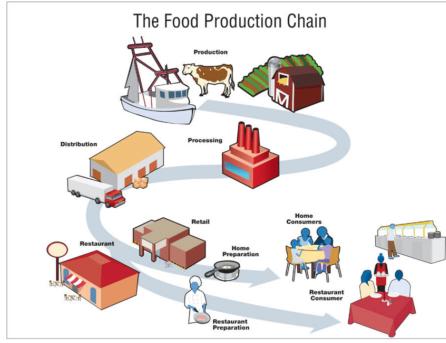
- Domain *modelling* (first principles)
- What-if *reasoning* and *explanations*



**Stuck at warehouse / fresh
OR**

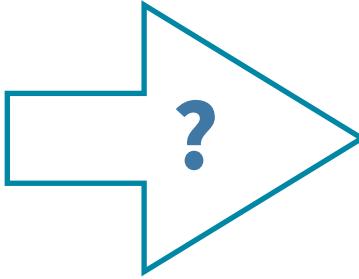
Traffic jam / not fresh

Automated Reasoning for Situational Awareness



Events...

GPS coordinates
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*Why is the truck late?
Are the tomatoes still fresh?*

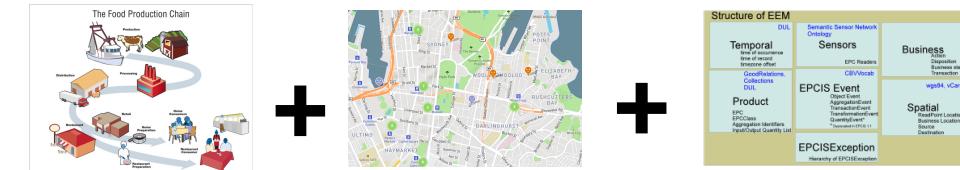
Why this is hard

- Incomplete/noisy/erroneous data
- Need domain knowledge ("fresh")?

Our *logic-based* approach

- Domain *modelling* (first principles)
- What-if reasoning and explanations

Implemented in the Fusemate system



Stuck at warehouse / fresh

OR

Traffic jam / not fresh

Demo



Observation: truck is in Sydney at the warehouse



T



Demo



Observation: truck is in Sydney at the warehouse



T

Demo



Observation: tomatoes are loaded



T

Demo

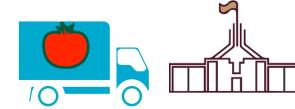


Observation: tomatoes are loaded



T

Demo



Assumption as per schedule: truck is on the road



T

Demo



Assumption as per schedule: truck is on the road



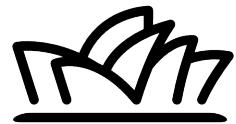
T

T+1

Demo



Report: truck is on the road



T

T+1

Demo



Report: truck is on the road



T



T+1



T+2

Demo



Conclusion: truck is on the road for too long - tomatoes are no longer fresh



T



T+1



T+2

Demo



Conclusion: truck is on the road for too long - tomatoes are no longer fresh



T



T+1



T+2

Demo



Report: actually, at T+1 truck was still in Sydney warehouse



T

T+1

T+2



Demo



Report: actually, at T+1 truck was still in Sydney warehouse



T



T+1



T+2

Demo



Conclusion: tomatoes are still fresh at T+2



T



T+1



T+2

Demo



Conclusion: tomatoes are still fresh at T+2



T



T+1



T+2

Demo



No information at T+3



T

T+1

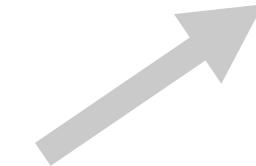
T+2

T+3

Demo



T+3: What if truck is on the road?



T

T+1

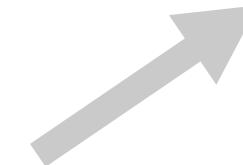
T+2

T+3

Demo



T+3: What if truck is on the road?



T

T+1

T+2

T+3

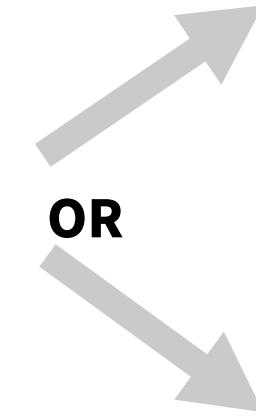
Demo



T+3: What if truck is on the road? At Canberra warehouse?



OR



T

T+1

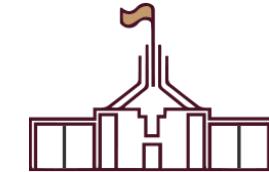
T+2

T+3

Demo



Report: truck at Canberra warehouse



T

T+1

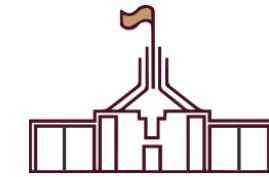
T+2

T+3

Demo



Report: truck at Canberra warehouse

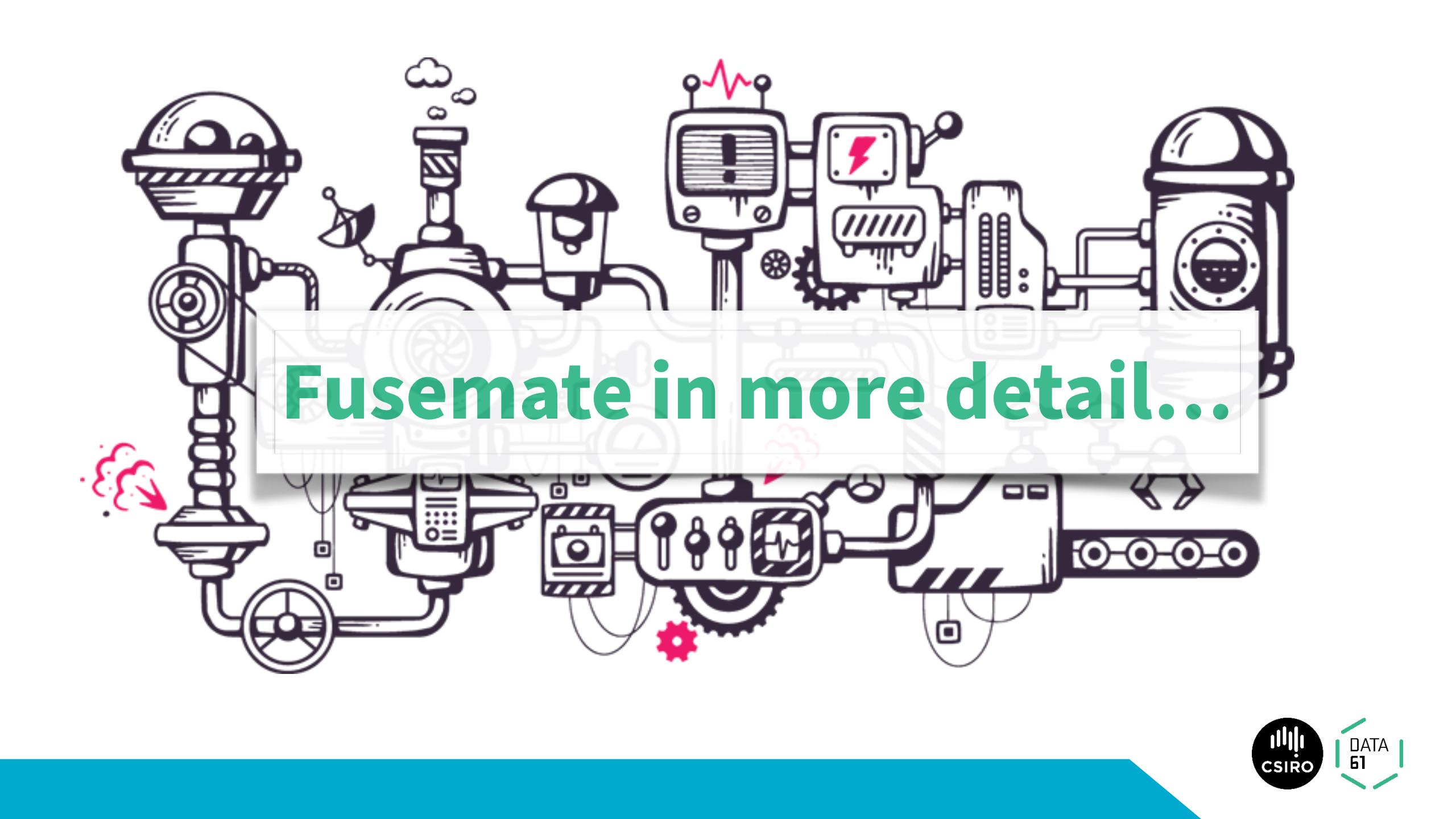


T

T+1

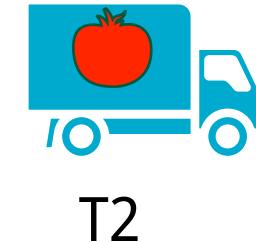
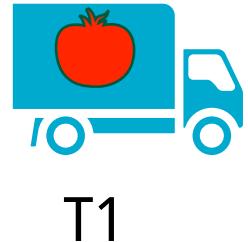
T+2

T+3



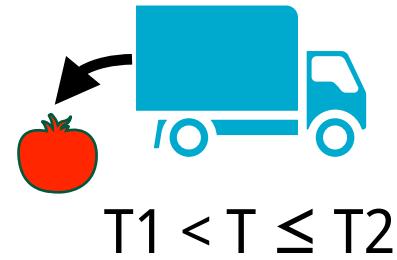
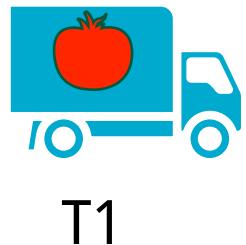
Fusemate in more detail...

Fusemate Model = If-Then Rules



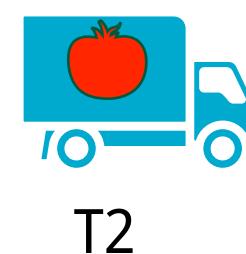
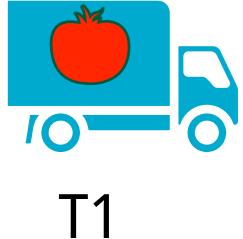
Time →

Fusemate Model = If-Then Rules



Fusemate Model = If-Then Rules

NO!



Time →

Fusemate Model = If-Then Rules

NO!

If



T1

and



then



T2

Time →

Fusemate Model = If-Then Rules



If $\text{in}(T_1, B, C) \& T_1 < T_2$ NOT exists T s.th. $T_1 < T \leq T_2 \& \text{unload}(T, B, C)$ then $\text{in}(T_2, B, C)$

Fusemate Model = If-Then Rules



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default reasoning: “not known” (# “known not”)

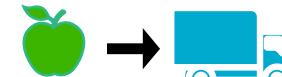
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If  →  at T_1 and  ←  at T_2 then

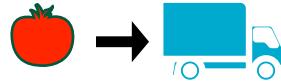
revise:  or revise: 

Fusemate Model = If-Then Rules



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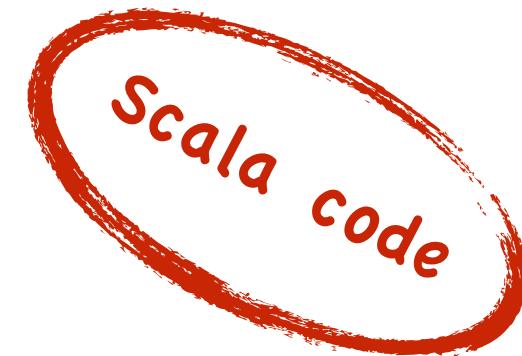
A model is a set of if-then rules plus ...

Model = If-Then Rules + Scala Class Hierarchy

```
abstract class Item { val perishable: Boolean }
abstract class Fruit extends Item { val perishable = true }
```

```
abstract class Vehicle { val speed: Int }
```

```
case class Truck(id: Int, time: DateTime, load: Set[Item]) extends Vehicle with LogicFact {
    val speed = 80
    val rules = List(
        Truck(id, t, load - item) :- Unload(id, t, item), ...
    )
    def hasPerishableLoad = load contains { _.perishable = true }
}
```



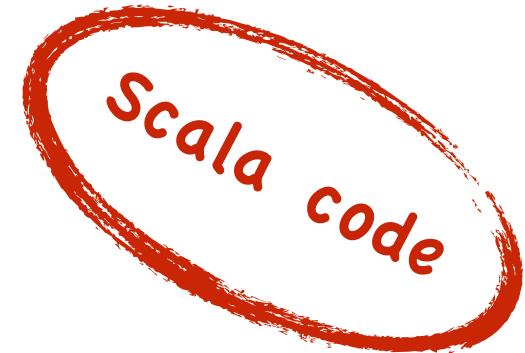
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}
```



Scala code

If-then rule extension

Model = If-Then Rules + Scala Class Hierarchy

```
case class Truck(id: Int, time: DateTime, load: Set[Item]) ... {
```

```
...
```

```
@rules(id, time, load)
```

```
val rules = List(
```

```
Fail :-
```

```
    Unload(id, time, item),
```

```
    IF (! load contains items)
```

```
Truck(id, next, load - item) :-
```

```
    Step(next, time),
```

```
    Unload(id, time, item),
```

```
    NOT(t < time, Unload(id, t, item))
```

```
)
```

```
}
```

Model = If-Then Rules + Scala Class Hierarchy

Scala library “set”

```
case class Truck(id: Int, time: DateTime, load: Set[Item]) ... {
```

...

@rules(id, time, load)

val rules = List(

Fail :-

Unload(id, time, item),

IF (! load contains items)

Truck(id, next, load - item) :-

Step(next, time),

Unload(id, time, item),

NOT(t < time, Unload(id, t, item))

)

}

Model = If-Then Rules + Scala Class Hierarchy

Scala library “set”

```
case class Truck(id: Int, time: DateTime, load: Set[Item]) ... {
```

...

@rules(id, time, load)

Macro annotation

val rules = List(

Fail :-

Unload(id, time, item),

IF (! load contains items)

Truck(id, next, load - item) :-

Step(next, time),

Unload(id, time, item),

NOT(t < time, Unload(id, t, item))

)

}

Model = If-Then Rules + Scala Class Hierarchy

Scala library “set”

```
case class Truck(id: Int, time: DateTime, load: Set[Item]) ... {
```

...

@rules(id, time, load)

val rules = List(

Fail :-

Unload(id, time, item),

IF (! load contains items)

Truck(id, next, load - item) :- Expansion

Step(next, time),

Unload(id, time, item),

NOT(t < time, Unload(id, t, item))

)

}

Macro annotation

```
case (Step(next, time1), Unload(id1, time2, item)) if  
time1 == time && time2 == time && id1 == id  
!(model exists {  
    case Unload(id2, t, item1) if id2 == id &&  
        t < time && item1 == item => true  
    case _ => false  
}  
}) => Truck(id, next, load - item)
```

Modelling Paradigm Summary

Rules

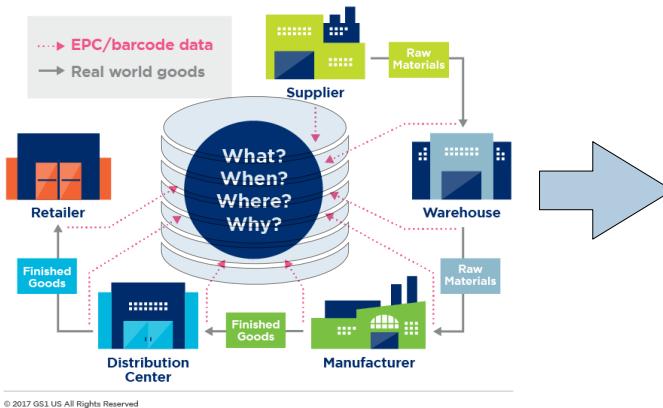
- Inferences** on basis of incomplete information
- Derive **multiple** plausible explanations
- Fix erroneous event data and revise explanations

Scala

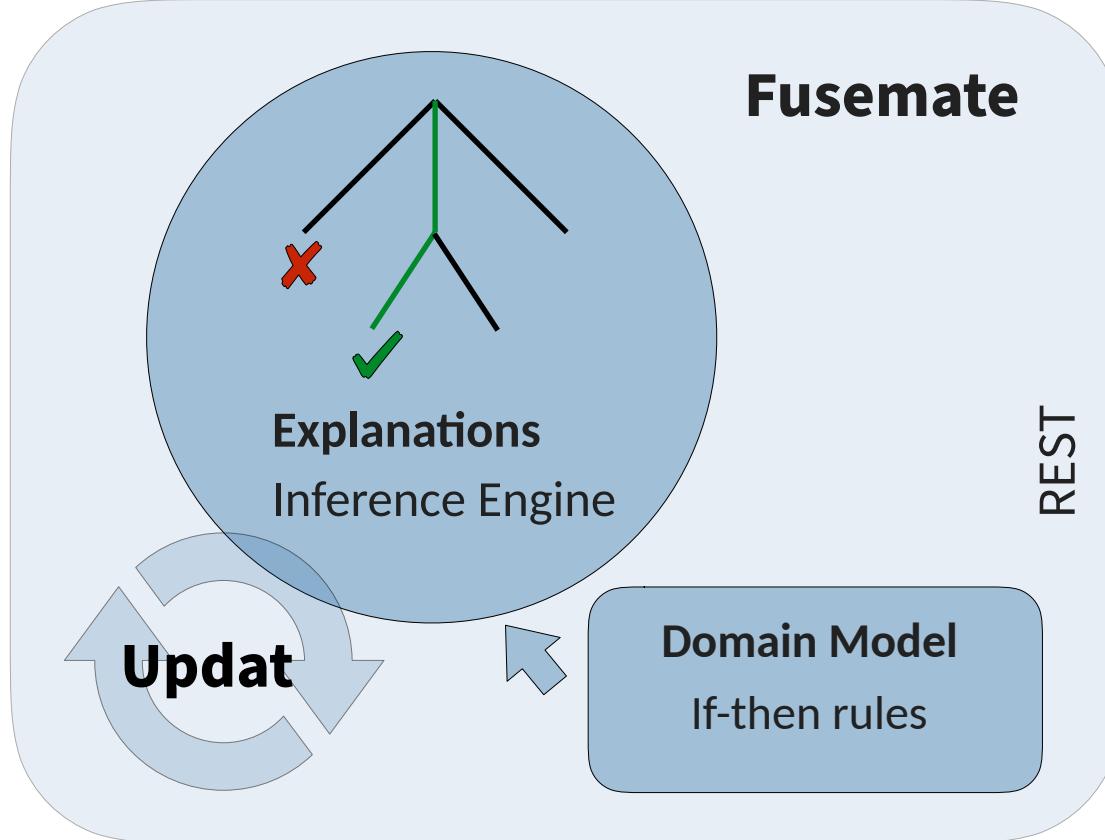
- Rich data structures
- Java connectivity
- Inference engine



System Architecture



EPCIS Events



Domain Model - e.g., *If item I is unpacked from a container C at time T then I must have been packed into C at some time S < T*

EPCIS Events - EPCIS events are sent to fusemate as they become available

Explanations - The inference engine derives a set of plausible models consistent with the EPCIS events so far

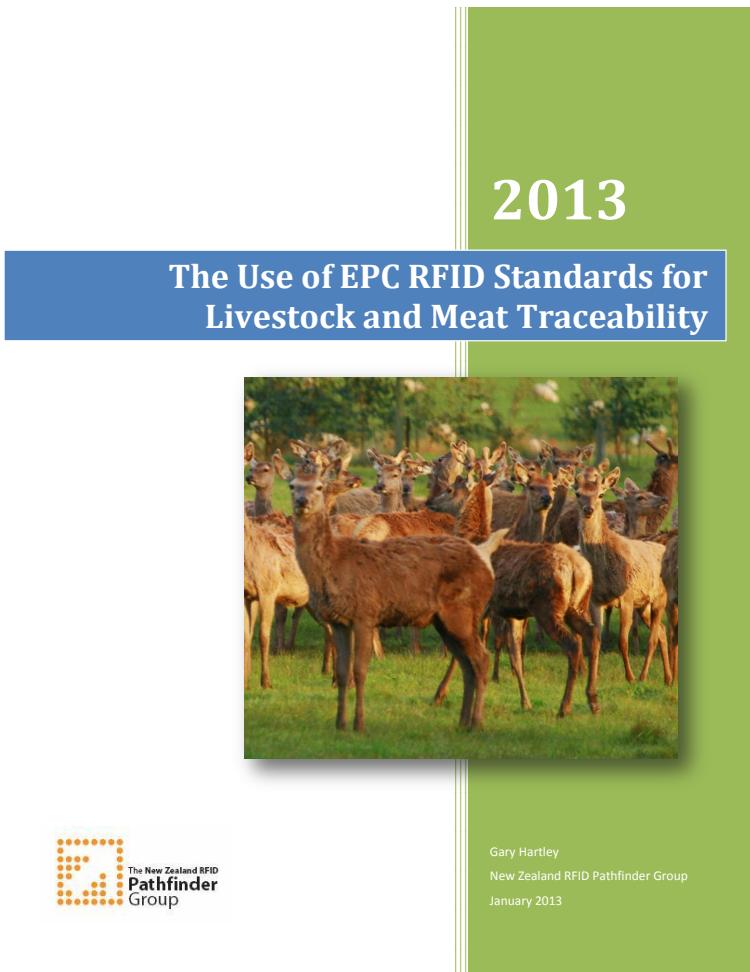
Q/A/C - *Where was item I at time T? Item I was unpacked from container C at time T and loc L. Item I has never arrived at L!*

Update - Plausible models are updated on every new EPCIS event and command provided by user



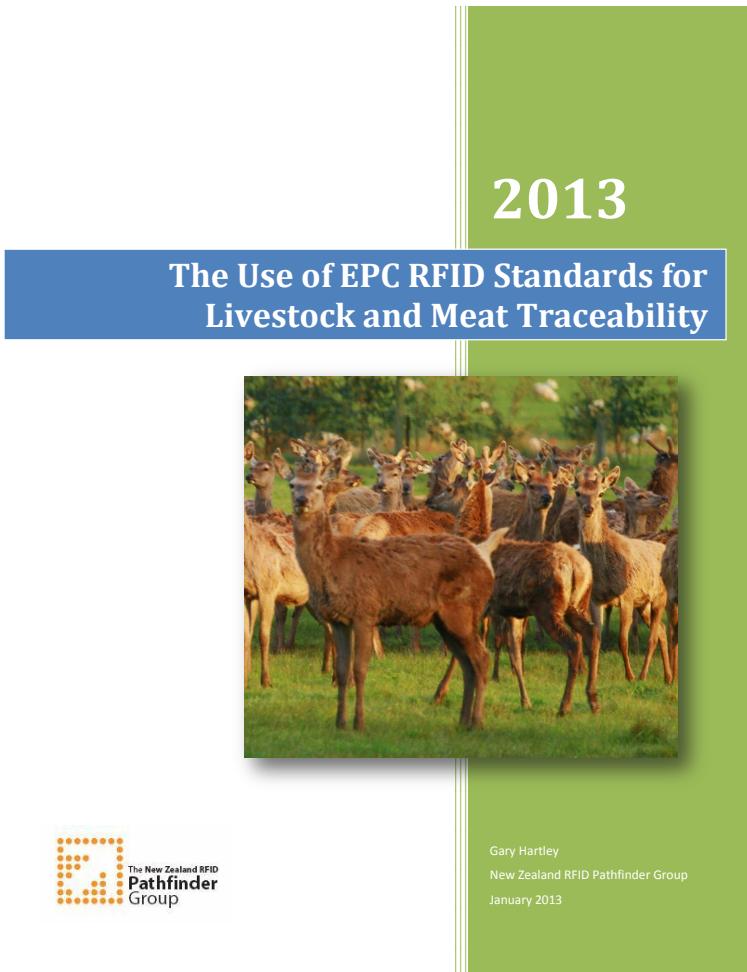
Case Study

Case Study - Deer Supply Chain



Gary Hartley
New Zealand RFID Pathfinder Group
January 2013

Case Study - Deer Supply Chain



12 events - from farm (NZ) to retailer (DE) encoded in EPCIS

Case Study - Deer Supply Chain

The cover of the report features a green background with the year '2013' in large white text. Below it, a blue banner contains the title 'The Use of EPC RFID Standards for Livestock and Meat Traceability'. A photograph of a herd of deer in a field is positioned at the bottom left. At the bottom right, there is a logo for 'The New Zealand RFID Pathfinder Group' with the text 'Gary Hartley' and 'New Zealand RFID Pathfinder Group January 2013'.



7

12 events - from farm (NZ) to retailer (DE) encoded in EPCIS

Case Study - Deer Supply Chain

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Gary Hartley
New Zealand RFID Pathfinder Group
January 2013

The New Zealand RFID Pathfinder Group

EPCIS Event Details	
Event Time	16/10/2012 11:54:38 +1300
Timezone Offset	+13:00
Event Type	ObjectEvent
Action	ADD
EPC	urn:epc:id:sgtin:9421900217.003.1073742106 urn:epc:id:sgtin:9421900217.003.1073742107 urn:epc:id:sgtin:9421900217.003.1073742109 urn:epc:id:sgtin:9421900217.003.1073742110 urn:epc:id:sgtin:9421900217.003.1073742111 urn:epc:id:sgtin:9421900217.003.1073742112 urn:epc:id:sgtin:9421900217.003.1073742113 urn:epc:id:sgtin:9421900217.003.1073742114 urn:epc:id:sgtin:9421900217.003.1073742115 urn:epc:id:sgtin:9421900217.003.1073742116 urn:epc:id:sgtin:9421900217.003.1073742117 urn:epc:id:sgtin:9421900217.003.1073742118 urn:epc:id:sgtin:9421900217.003.1073742119 urn:epc:id:sgtin:9421900217.003.1073742120 urn:epc:id:sgtin:9421900217.003.1073742121 urn:epc:id:sgtin:9421900217.003.1073742122 urn:epc:id:sgtin:9421900217.003.1073742123 urn:epc:id:sgtin:9421900217.003.1073742124 urn:epc:id:sgtin:9421900217.003.1073742126 urn:epc:id:sgtin:9421900217.003.1073742127 urn:epcglobal:cbv:bizstep:commissioning urn:epcglobal:cbv:disp:active urn:epc:id:sгин:942900.009772.ON_FARM urn:epc:id:sгин:942900.009772.DEER_CRUSH
BizStep	
Disposition	
BizLocation	
Read Point	

Table 6.3 - Commissioning event - tagging of animals

7

12 events - from farm (NZ) to retailer (DE) encoded in EPCIS

Case Study - Deer Supply Chain

2013

The Use of EPC RFID Standards for Livestock and Meat Traceability

Gary Hartley
New Zealand RFID Pathfinder Group
January 2013

The New Zealand RFID Pathfinder Group

Process Step 4 - Animals

Figure 5.7 - S

Figure 5.7 illustrates animal animals. Figure 5.8 illustrates

Process Step 5 - Cartons processor and moved from

Figure 5.9 - UHF RFID ta used on cartons

Figure 5.9, Figure 5.10 and in the boning room and mo for loading the shipping con

EPCIS Event Details

Event Time: 16/10/2012 11:54:38 +1200

Event Type: ObjectEvent

Action: DELETE

EPC: urn:epc:id:sgtin:94130000.01420.11, urn:epc:id:sgtin:94130000.01420.18, urn:epc:id:sgtin:94130000.01420.2, urn:epc:id:sgtin:94130000.01420.22, urn:epc:id:sgtin:94130000.01420.23

BizStep: urn:epcglobal:cbv:bizstep:receiving

Disposition: urn:epcglobal:sellable_accessible

BizLocation: urn:epc:id:sqln:4023339.00000.IN_STORE

Read Point: urn:epc:id:sqln:4023339.00000.RECEIVING_BAY

EPCIS Event Details

Event Time: 12/12/2012 01:58:34 +1300

Timezone Offset: +01:00

Event Type: ObjectEvent

Action: DELETE

EPC: urn:epc:id:sgtin:9421900217.003.1073742126, urn:epc:id:sgtin:9421900217.003.1073742127

BizStep: urn:epcglobal:cbv:bizstep:commissioning

Disposition: urn:epcglobal:cbv:disp:active

BizLocation: urn:epc:id:sqln:942900.009772.ON_FARM

Read Point: urn:epc:id:sqln:942900.009772.DEER_CRUSH

Table 6.3 - Commissioning event - tagging of animals

7

12 events - from farm (NZ) to retailer (DE) encoded in EPCIS

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Where - Read point

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Where - Read point

Where - Biz location

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Where - Read point

Where - Biz location

Why - Biz step - Disposition

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Where - Read point

Where - Biz location

Why - Biz step - Disposition

How

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Where - Read point

Where - Biz location

Why - Biz step - Disposition

How

When

Case Study - WWWW

EPCIS defines lower-level events and higher-level “WWWW” concepts

WWWW - What? Where? When? Why?

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

What

Where - Read point

Where - Biz location

Why - Biz step - Disposition

How

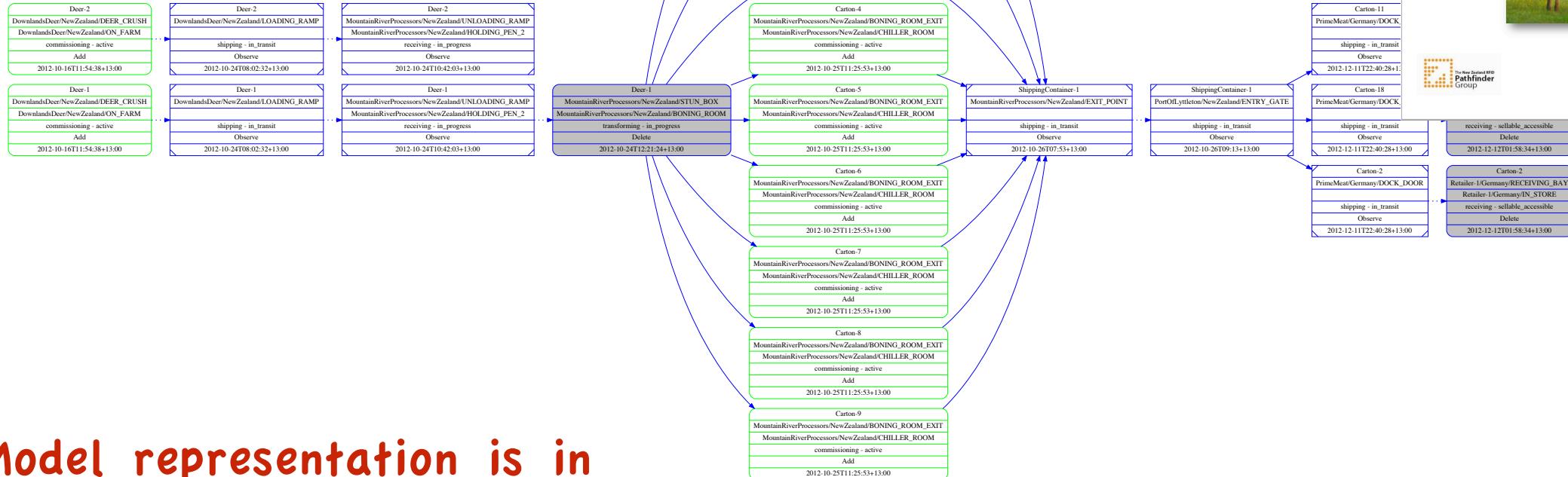
When

There are if-then rules for deriving **WWWWs** from EPCIS low-level events

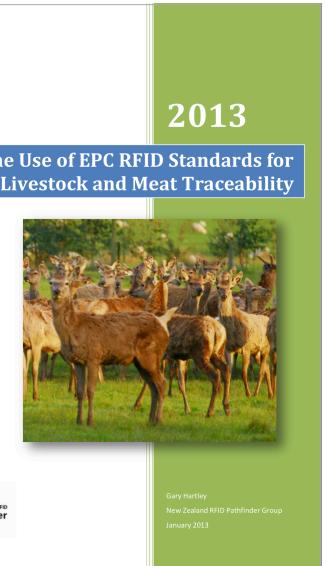
Case Study - Overview

Fusemate output

Tracking “Deer-1” and “Deer-2”



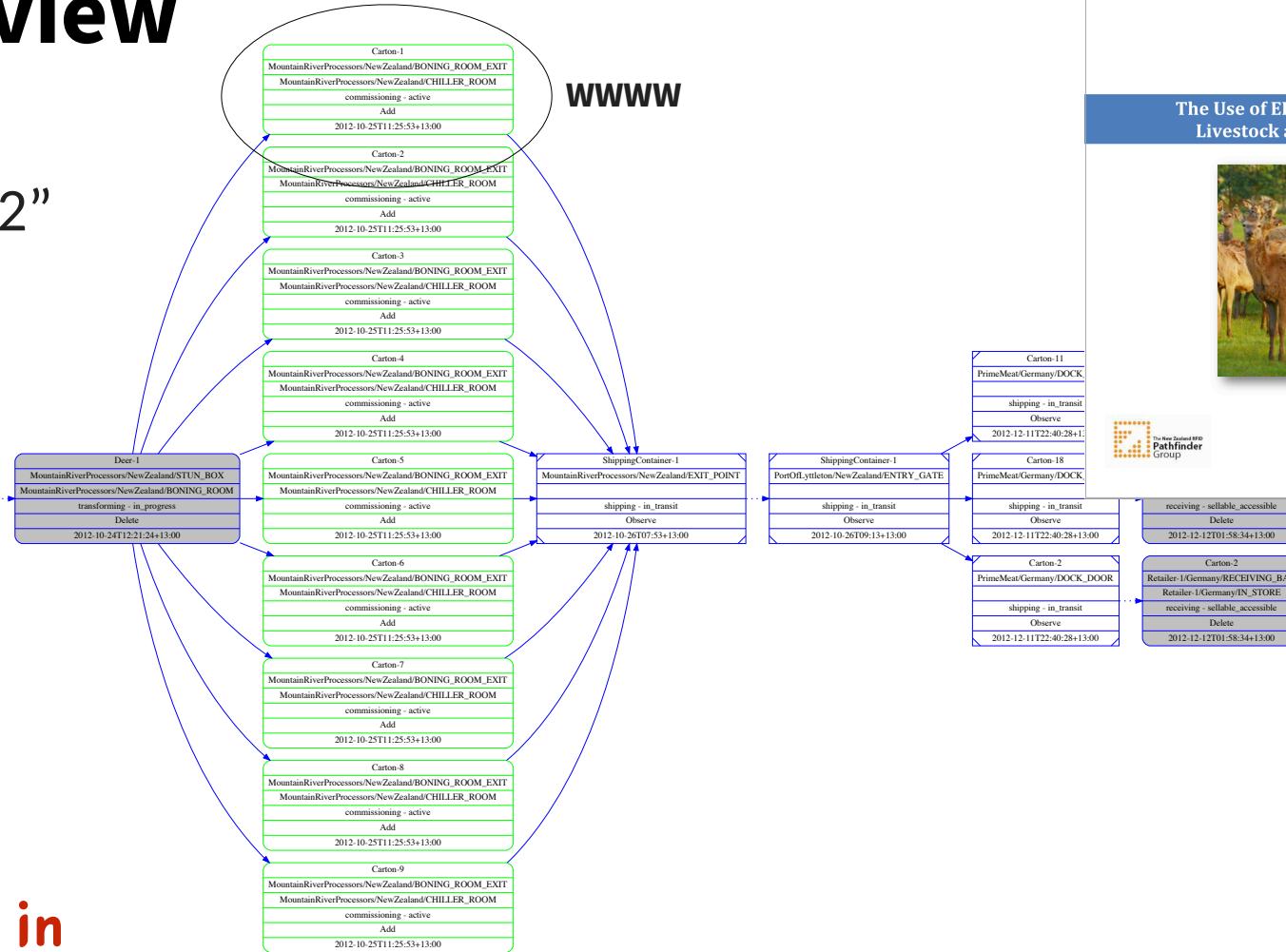
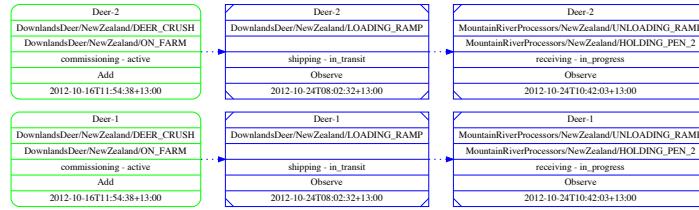
Model representation is in terms of WWW, Aggregation and Association concepts



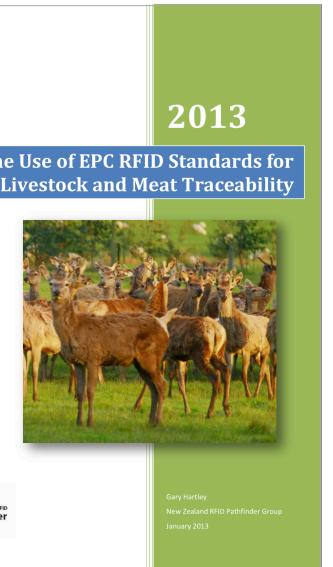
Case Study - Overview

Fusemate output

Tracking “Deer-1” and “Deer-2”



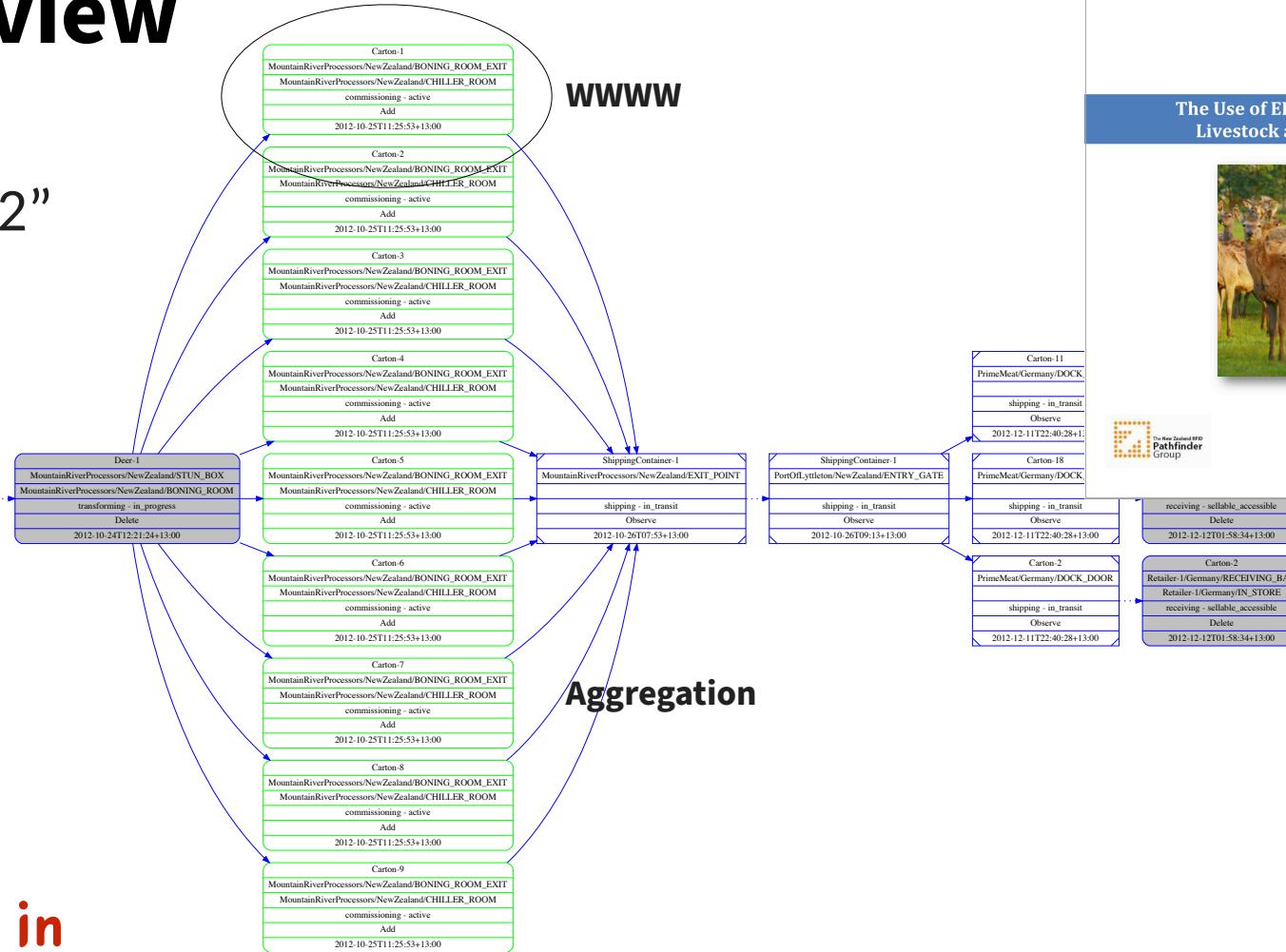
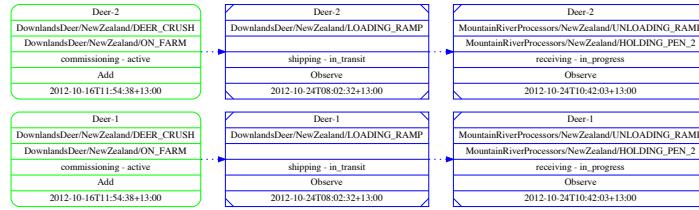
Model representation is in terms of WWW, Aggregation and Association concepts



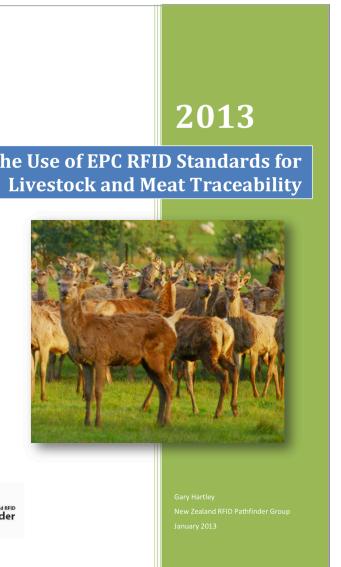
Case Study - Overview

Fusemate output

Tracking “Deer-1” and “Deer-2”



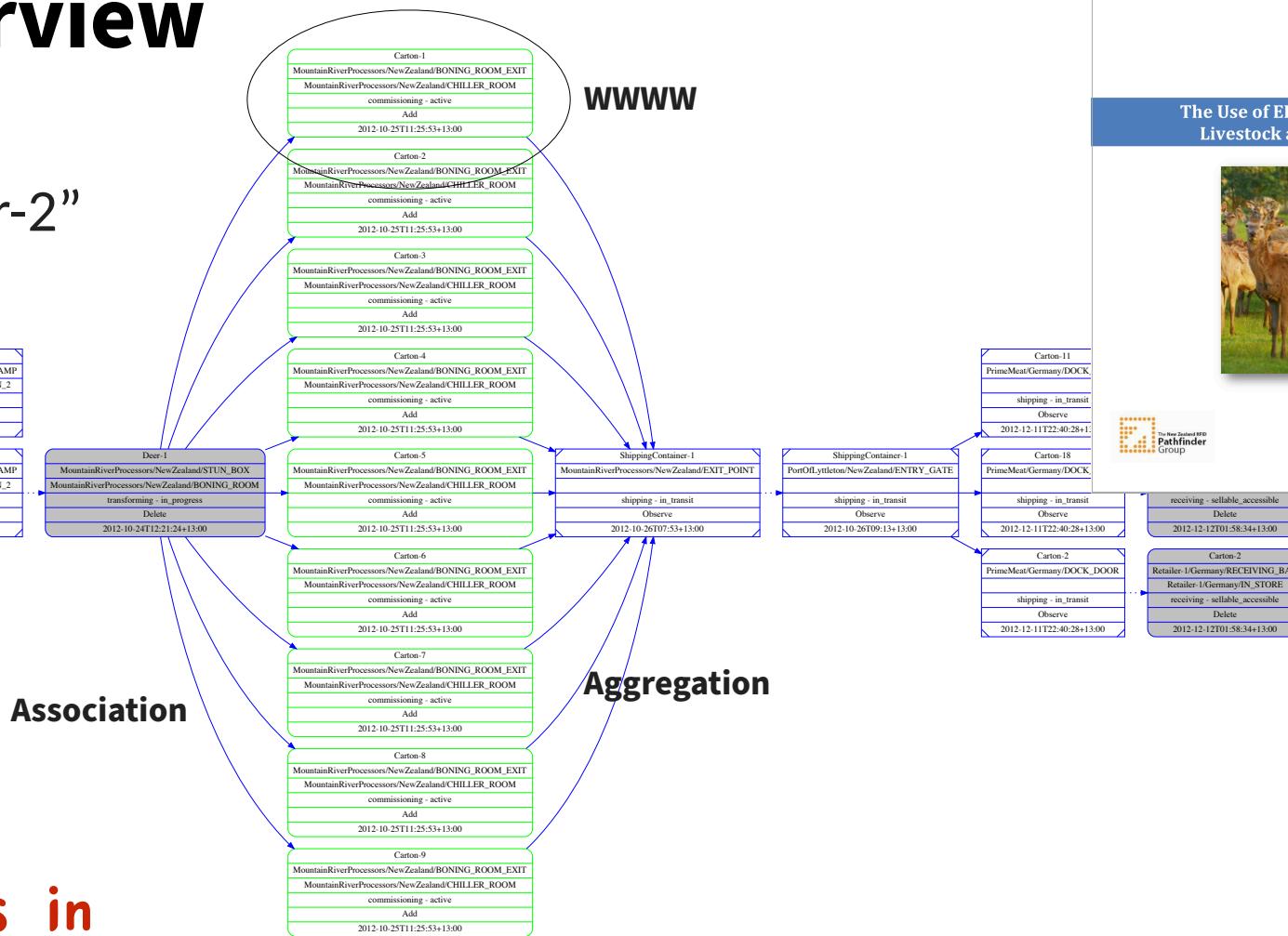
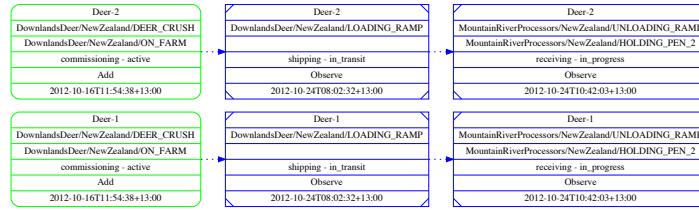
Model representation is in terms of WWW, Aggregation and Association concepts



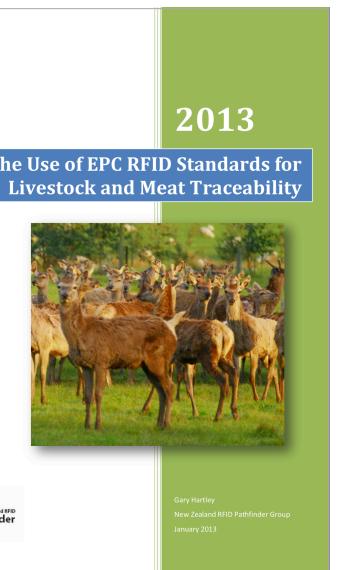
Case Study - Overview

Fusemate output

Tracking “Deer-1” and “Deer-2”



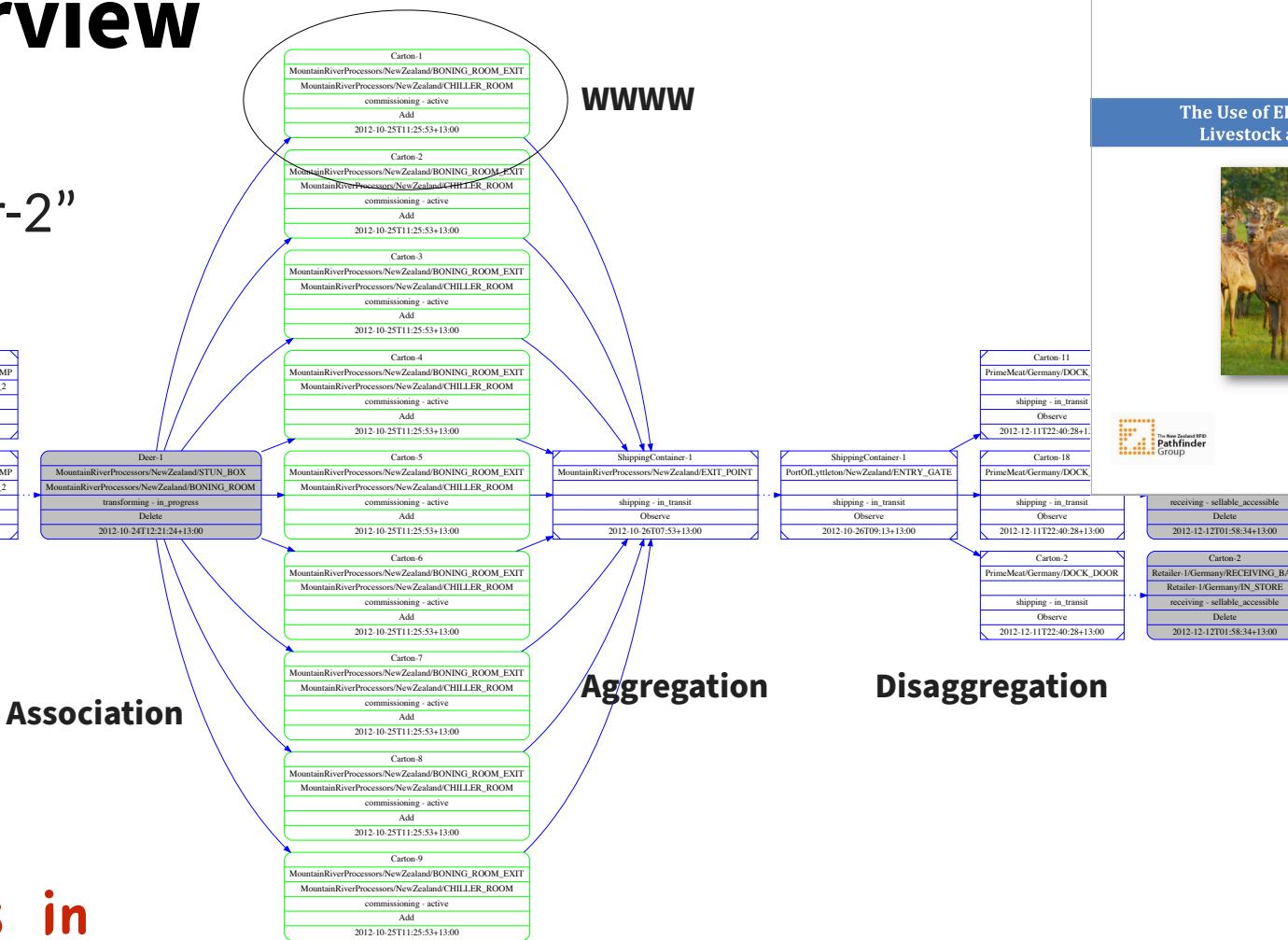
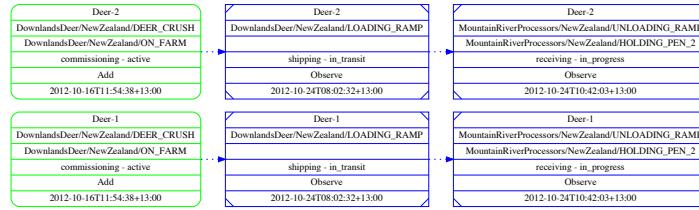
Model representation is in terms of WWW, Aggregation and Association concepts



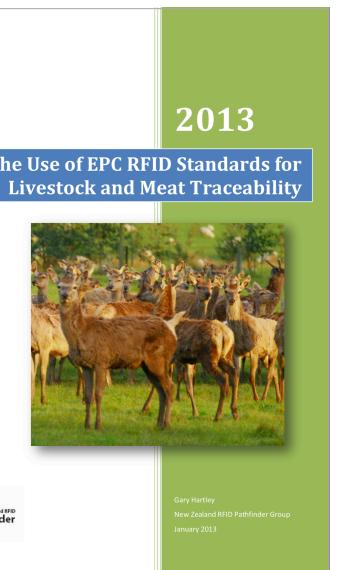
Case Study - Overview

Fusemate output

Tracking “Deer-1” and “Deer-2”



Model representation is in terms of WWW, Aggregation and Association concepts



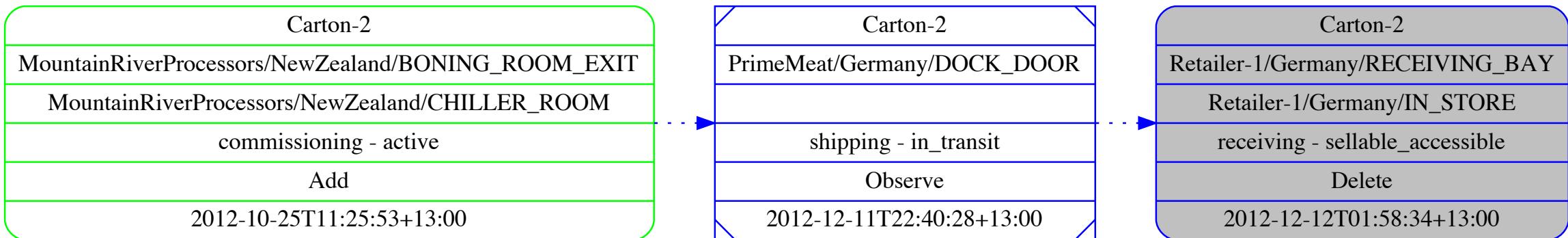
Modelling Experiment - Multiple Explanations

Carton-2
MountainRiverProcessors/NewZealand/BONING_ROOM_EXIT
MountainRiverProcessors/NewZealand/CHILLER_ROOM
commissioning - active
Add
2012-10-25T11:25:53+13:00

Carton-2
PrimeMeat/Germany/DOCK_DOOR
shipping - in_transit
Observe
2012-12-11T22:40:28+13:00

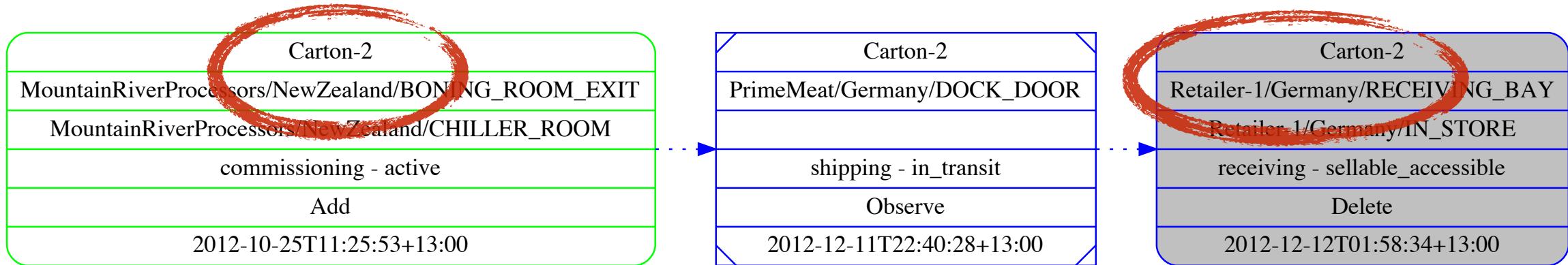
Carton-2
Retailer-1/Germany/RECEIVING_BAY
Retailer-1/Germany/IN_STORE
receiving - sellable_accessible
Delete
2012-12-12T01:58:34+13:00

Modelling Experiment - Multiple Explanations



What is known

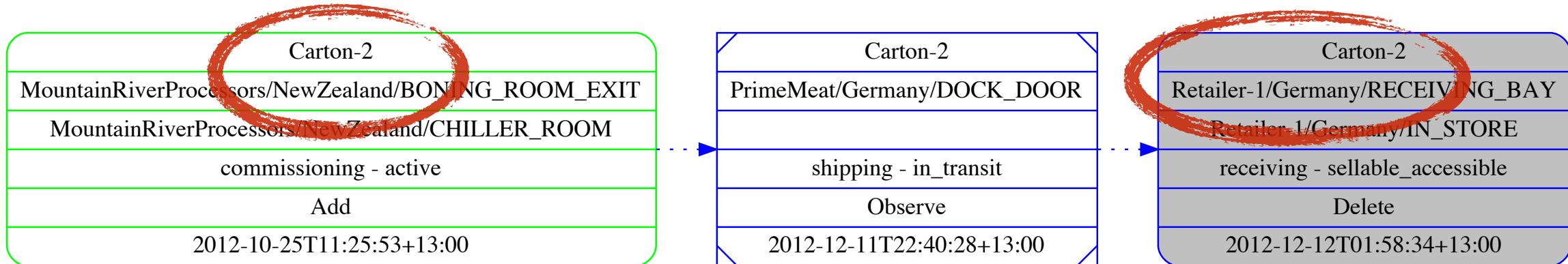
Modelling Experiment - Multiple Explanations



What is known

- Carton-2 has arrived at Retailer-1 in Germany

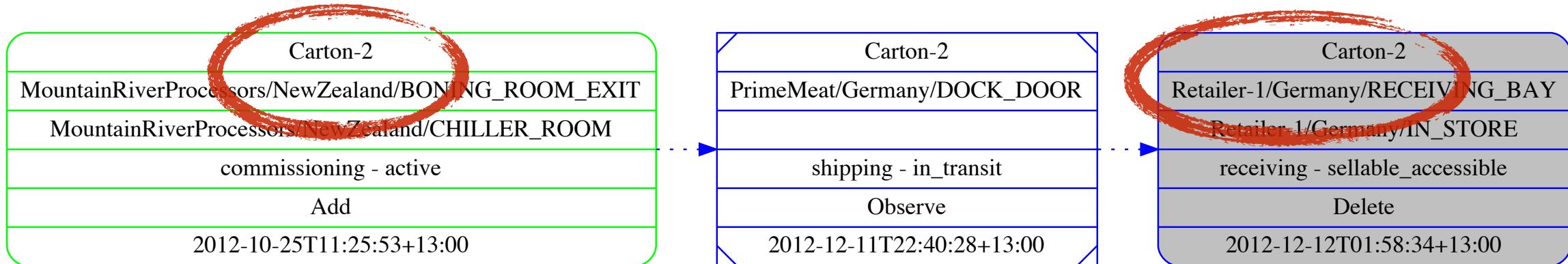
Modelling Experiment - Multiple Explanations



What is known

- Carton-2 has arrived at Retailer-1 in Germany
- Carton-13 was added to the supply chain like Carton-2 above

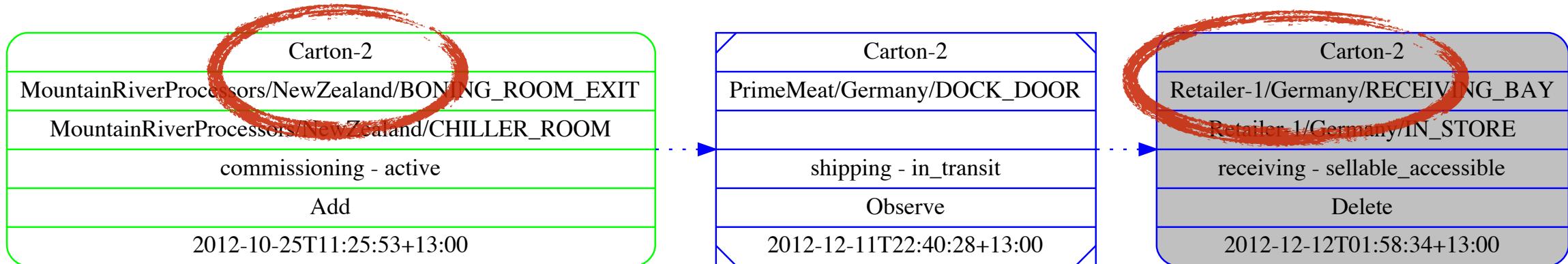
Modelling Experiment - Multiple Explanations



What is known

- Carton-2 has arrived at Retailer-1 in Germany
- Carton-13 was added to the supply chain like Carton-2 above
- Carton-13 leaves no trace but it should also have arrived at Retailer-1 in Germany

Modelling Experiment - Multiple Explanations



What is known

- Carton-2 has arrived at Retailer-1 in Germany
- Carton-13 was added to the supply chain like Carton-2 above
- Carton-13 leaves no trace but it should also have arrived at Retailer-1 in Germany

What went wrong?

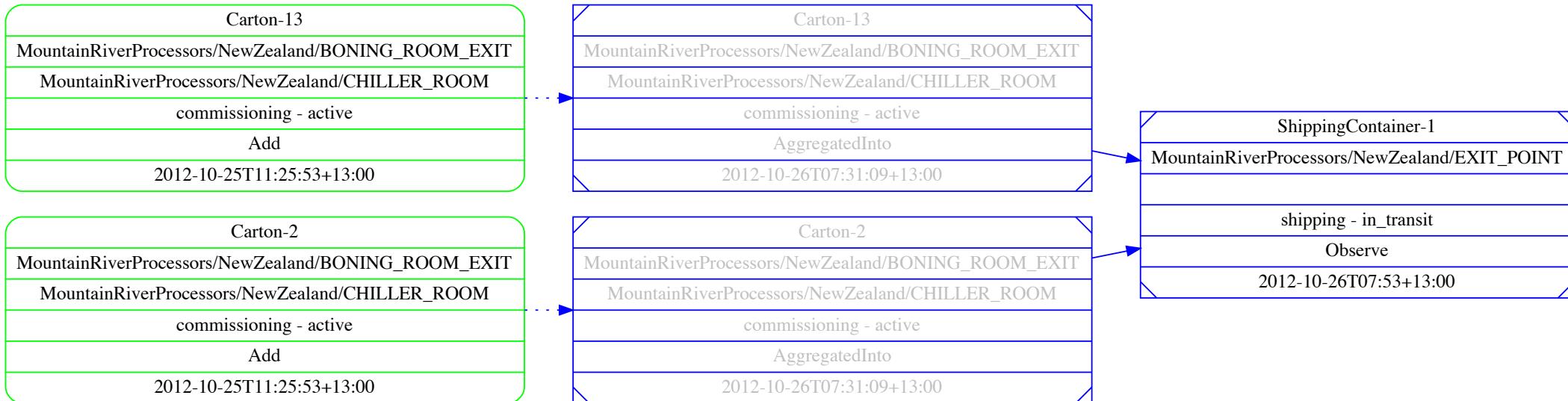
Fusemate diagnosis scenario - Compute some plausible explanations

Modelling Experiment - Multiple Explanations

We start the diagnosis by telling Fusemate that Carton-13 behaves like Carton-2

```
trackByCopy("urn:epc:id:sgtin:94130000.01420.2", "urn:epc:id:sgtin:94130000.01420.13")
```

Result



Modelling Experiment - Multiple Explanations

We start the diagnosis by telling Fusemate that Carton-13 behaves like Carton-2

```
trackByCopy("urn:epc:id:sgtin:94130000.01420.2", "urn:epc:id:sgtin:94130000.01420.13")
```

Result

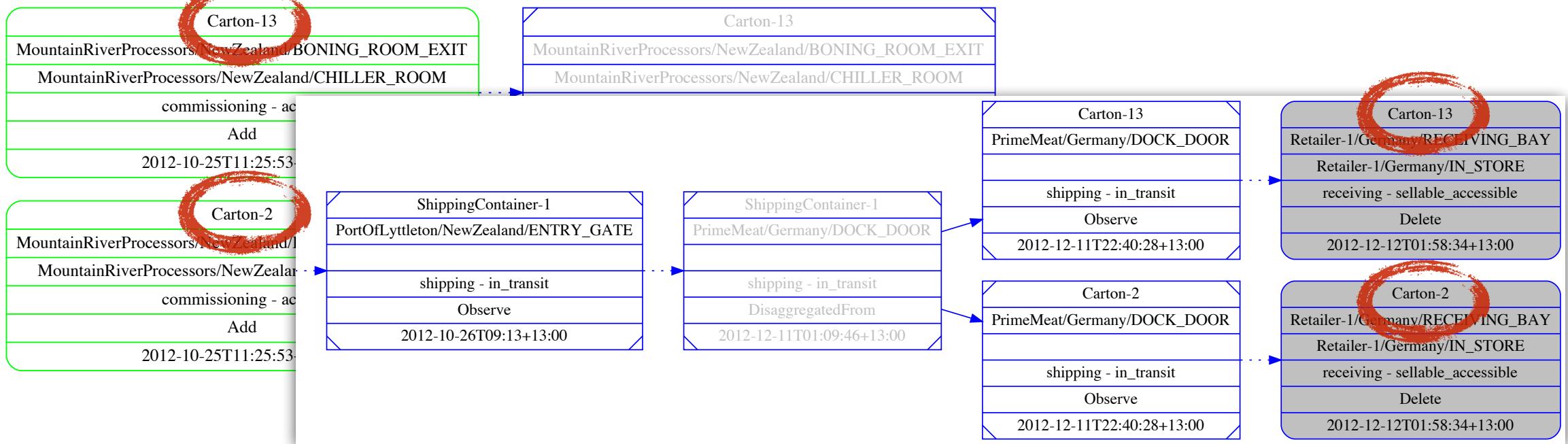


Modelling Experiment - Multiple Explanations

We start the diagnosis by telling Fusemate that Carton-13 behaves like Carton-2

```
trackByCopy("urn:epc:id:sgtin:94130000.01420.2", "urn:epc:id:sgtin:94130000.01420.13")
```

Result

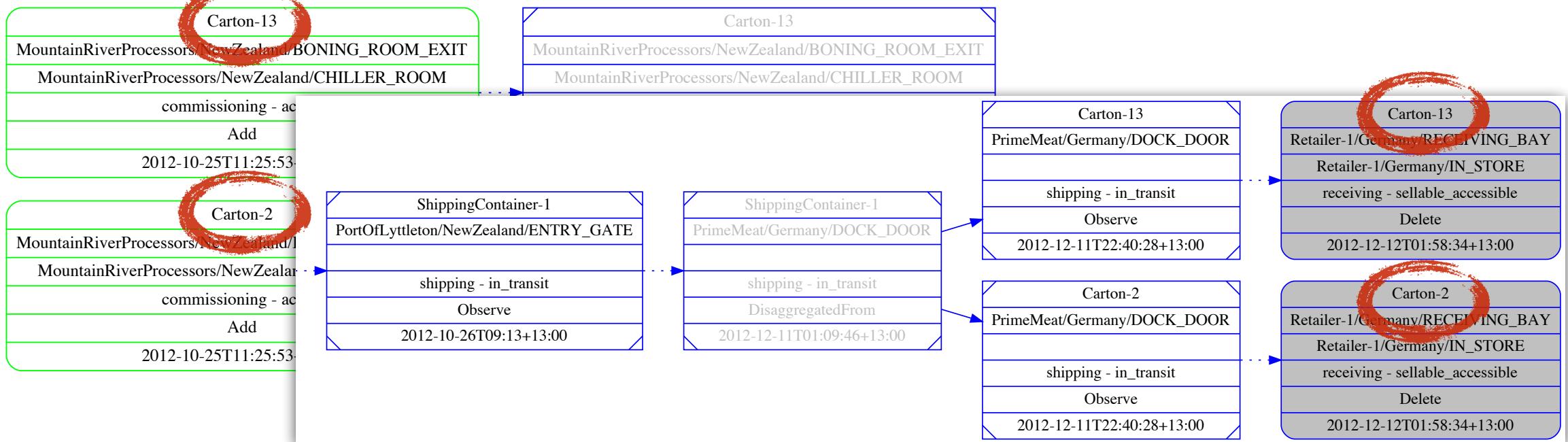


Modelling Experiment - Multiple Explanations

We start the diagnosis by telling Fusemate that Carton-13 behaves like Carton-2

```
trackByCopy("urn:epc:id:sgtin:94130000.01420.2", "urn:epc:id:sgtin:94130000.01420.13")
```

Result



Now add knowledge of what (not) happened

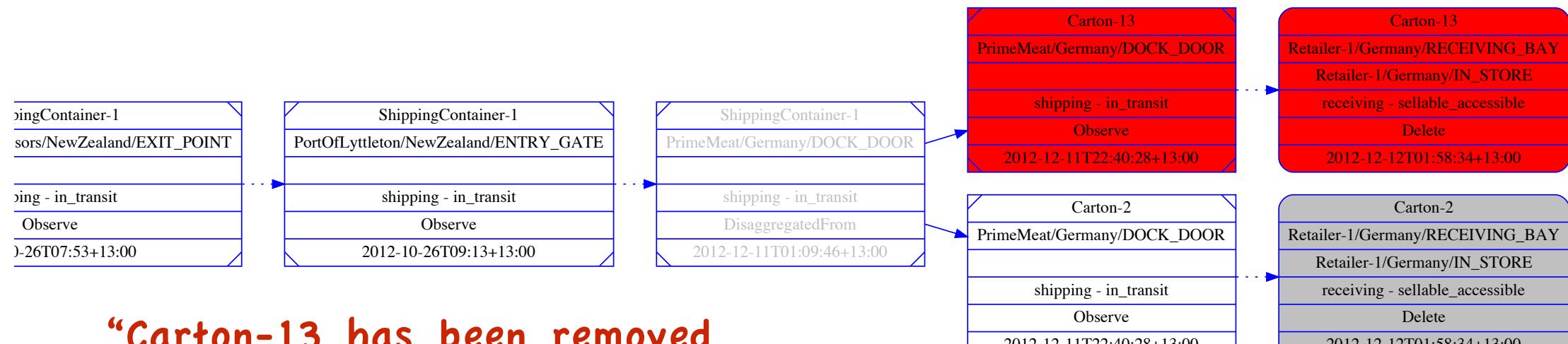
Modelling Experiment - Multiple Explanations

A phone call confirms that Carton-13 was not seen at the DOCK_DOOR any time after 11/12/2012:
This information is provided to Fusemate (details not shown here)

Plausible Explanation (1)

Negative conclusions

= “known not”

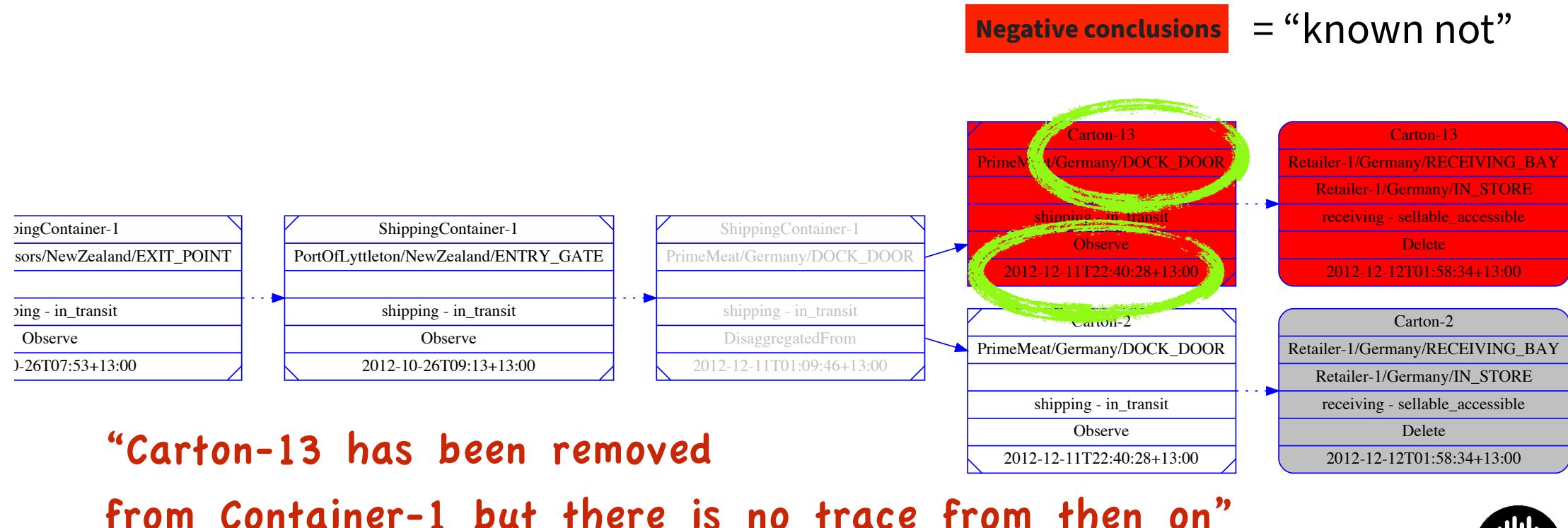


**“Carton-13 has been removed
from Container-1 but there is no trace from then on”**

Modelling Experiment - Multiple Explanations

A phone call confirms that Carton-13 was not seen at the DOCK_DOOR any time after 11/12/2012:
This information is provided to Fusemate (details not shown here)

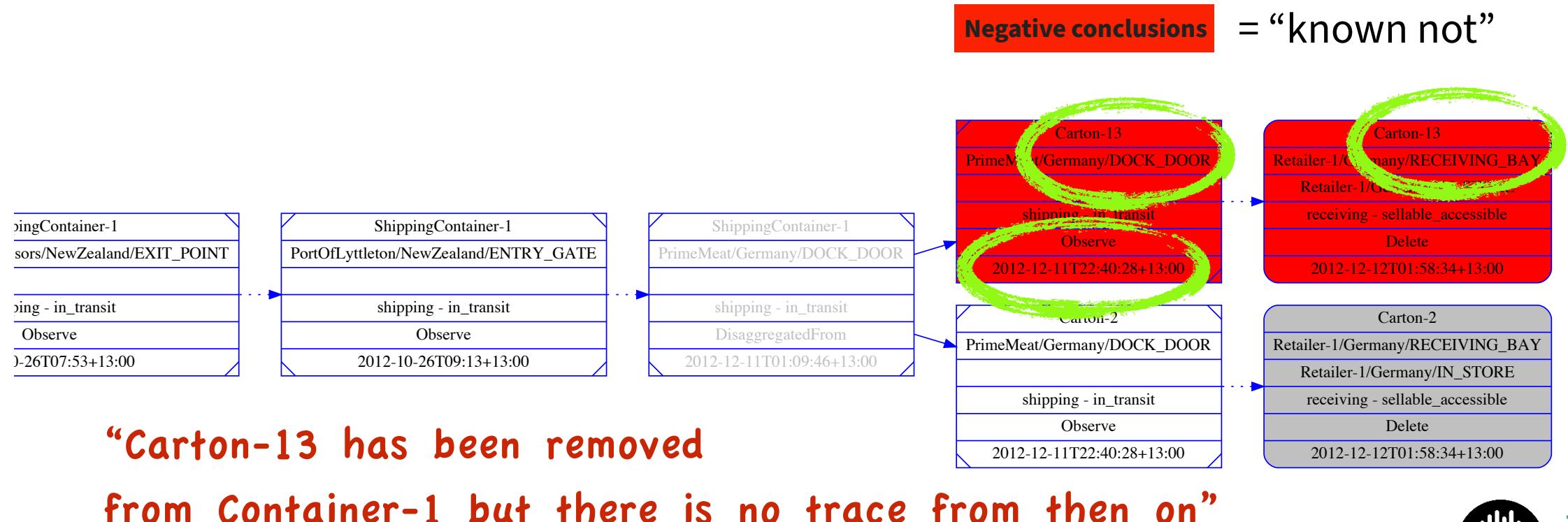
Plausible Explanation (1)



Modelling Experiment - Multiple Explanations

A phone call confirms that Carton-13 was not seen at the DOCK_DOOR any time after 11/12/2012:
This information is provided to Fusemate (details not shown here)

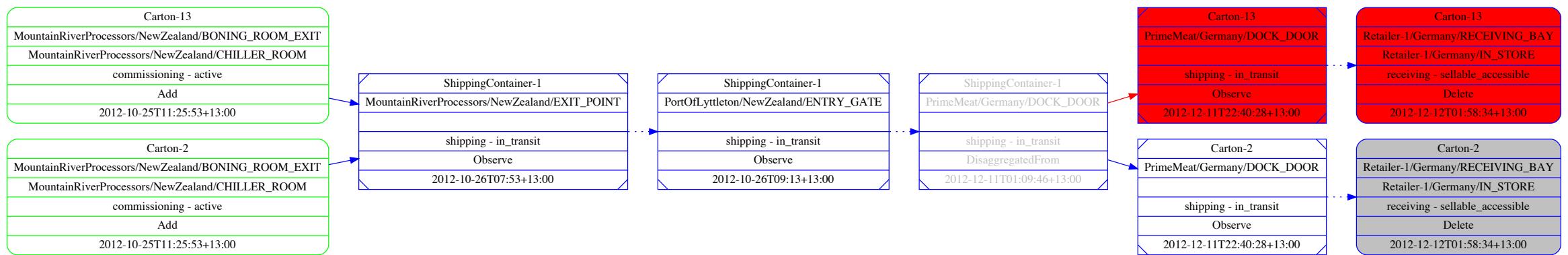
Plausible Explanation (1)



Modelling Experiment - Multiple Explanations

The user asks the system to compute the next plausible model

Plausible Explanation (2)

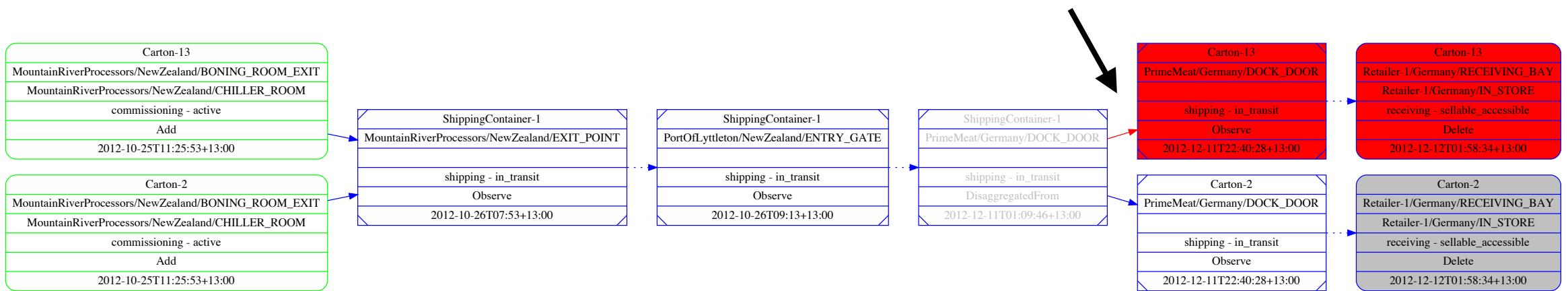


“Carton-13 has not been removed from Container-1 (still in the container?)”

Modelling Experiment - Multiple Explanations

The user asks the system to compute the next plausible model

Plausible Explanation (2)

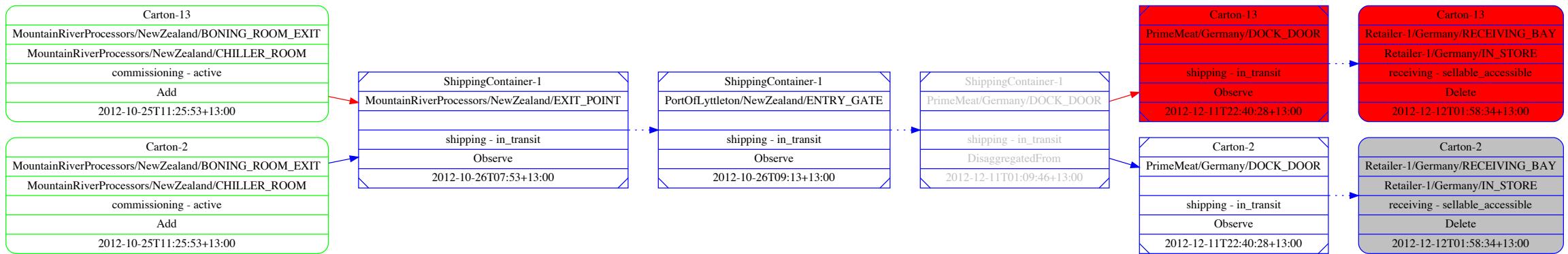


“Carton-13 has not been removed from Container-1 (still in the container?)”

Modelling Experiment - Multiple Explanations

The user asks the system to compute the next plausible model

Plausible Explanation (3)



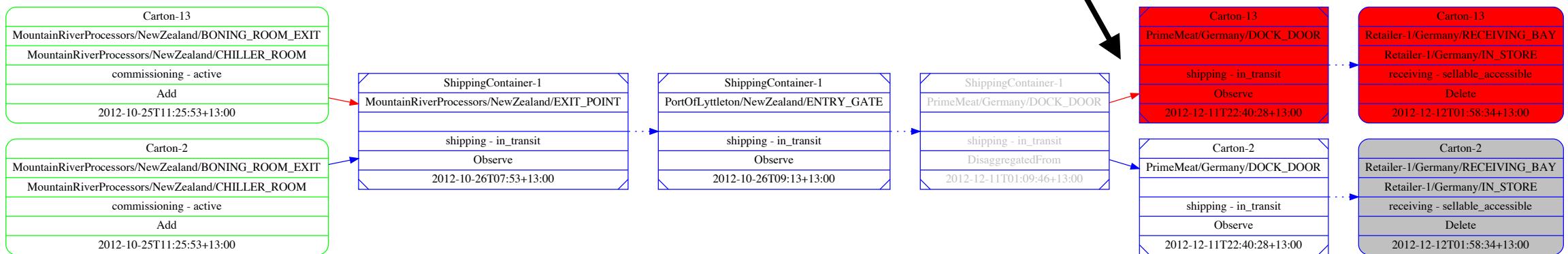
“Carton-13 was not loaded into Container-1 in the first place”
(And hence cannot be unloaded either as per rules)

Modelling Experiment - Multiple Explanations

The user asks the system to compute the next plausible model

Plausible Explanation (3)

Arrow remains in red

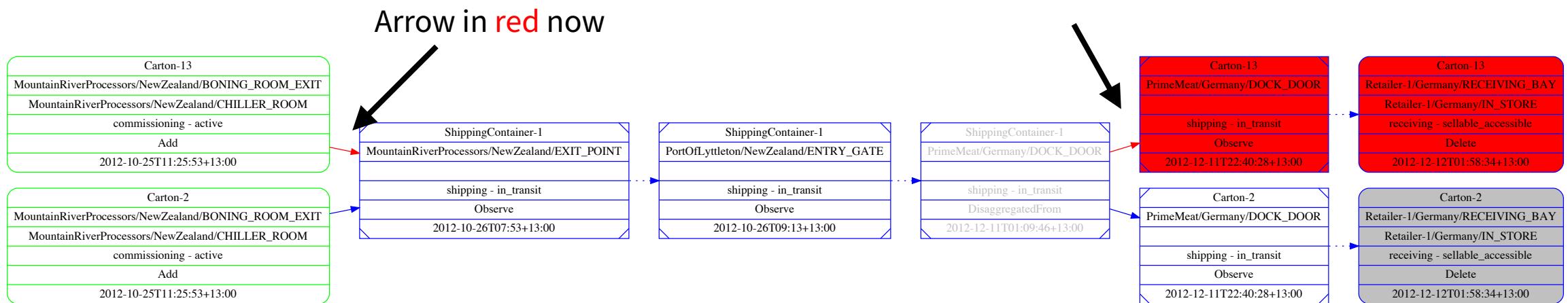


“Carton-13 was not loaded into Container-1 in the first place”
(And hence cannot be unloaded either as per rules)

Modelling Experiment - Multiple Explanations

The user asks the system to compute the next plausible model

Plausible Explanation (3)



“Carton-13 was not loaded into Container-1 in the first place”
(And hence cannot be unloaded either as per rules)

Modelling Experiment - Multiple Explanations

The user asks the system to compute the next plausible model

Plausible Explanation (4)

N/A

In particular fusemate does not generate:

“Carton-13 has been removed from the Container 1
but was not loaded earlier into Container 1”

User Interface - Under Development

```
OK  
command read("demo/deer/data/event-05.xml")  
OK  
command read("demo/deer/data/event-06.xml")  
OK  
command read("demo/deer/data/event-07.xml")  
OK  
command read("demo/deer/data/event-08.xml")  
OK  
command read("demo/deer/data/event-09.xml")  
OK  
command read("demo/deer/data/event-10.xml")
```

```
command track("urn:epc:id:sgtin:94130000.01420.2")
```

```
query currentModel filter { isAbout(_, "Carton-2") }
```

```
command toDotFile(currentModel, "demo/deer/out/client-tracking1.dot", display = true)
```

```
query toDot(currentModel)
```

Send Qu

0 1 2

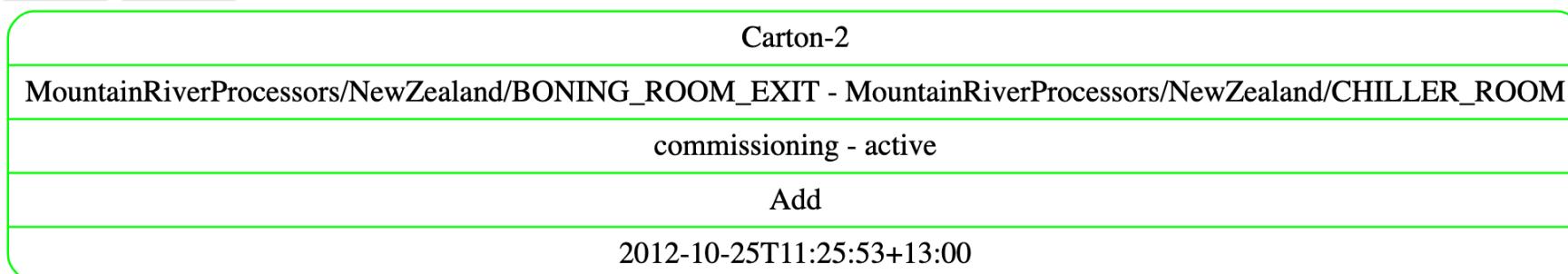
Json

Json Diff

Graph

Map

Old Graph New Graph



User Interface - Under Development

```
OK  
command read("demo/deer/data/event-09.xml")  
OK  
command read("demo/deer/data/event-10.xml")
```

```
command track("urn:epc:id:sgtin:94130000.01420.2")
```

```
query currentModel filter { isAbout(_, "Carton-2") }
```

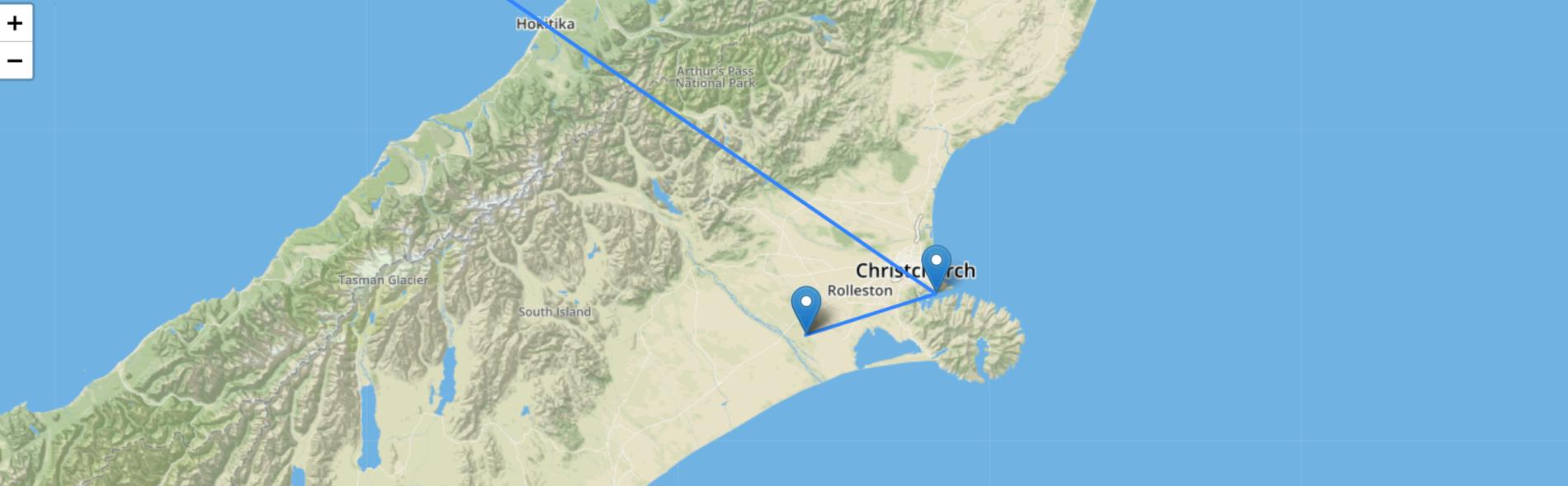
```
command toDotFile(currentModel, "demo/deer/out/client-tracking1.dot", display = true)
```

```
query toDot(currentModel)
```

Send Query

0 1 2

Json Json Diff Graph Map



Conclusions and Future Work

- Developed Fusemate situational awareness system
- Fusemate = Logic Programming + Belief Revision + Scala programming language
- Experimented with Deer supply chain case study
- Future work
 - User interface
 - More case studies
 - Integration with video tracking
 - Probabilities
 - Temporal logic $\square t . \text{shipped}(B) \rightarrow \diamond s . s \leq t + 5 \wedge \text{received}(B)$
 - Ontologies