

Towards A Simple Event Calculus for Run-Time Reasoning

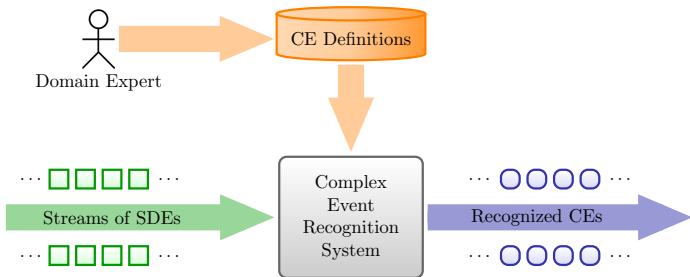
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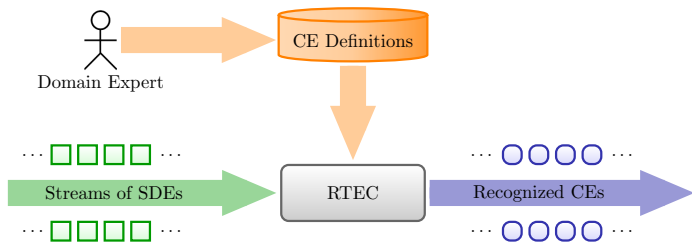
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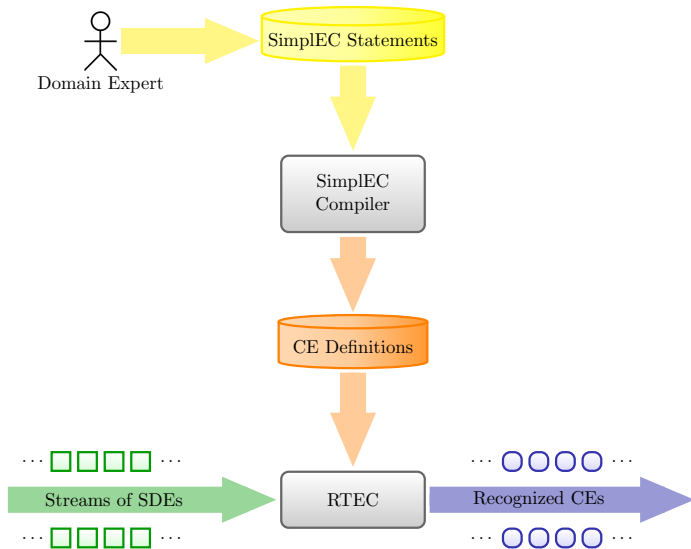
Complex Event Recognition



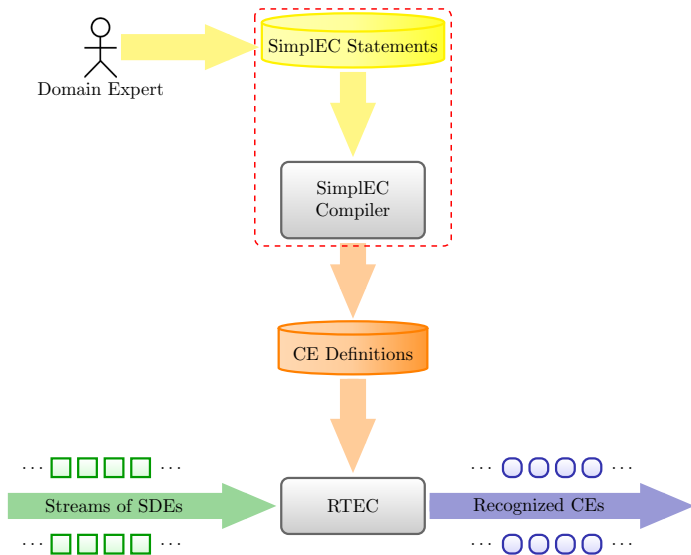
Complex Event Recognition



Complex Event Recognition



Complex Event Recognition



Event Calculus

- ▶ A **logic programming language** for representing and reasoning about events and their effects.
- ▶ Key components:
 - ▶ **event** (typically instantaneous).
 - ▶ **fluent**: a property that may have different values at different points in time.
- ▶ Built-in representation of **inertia**:
 - ▶ $F = V$ holds at a particular time-point if $F = V$ has been *initiated* by an event at some earlier time-point, and not *terminated* by another event in the meantime.

Run-Time Event Calculus (RTEC)

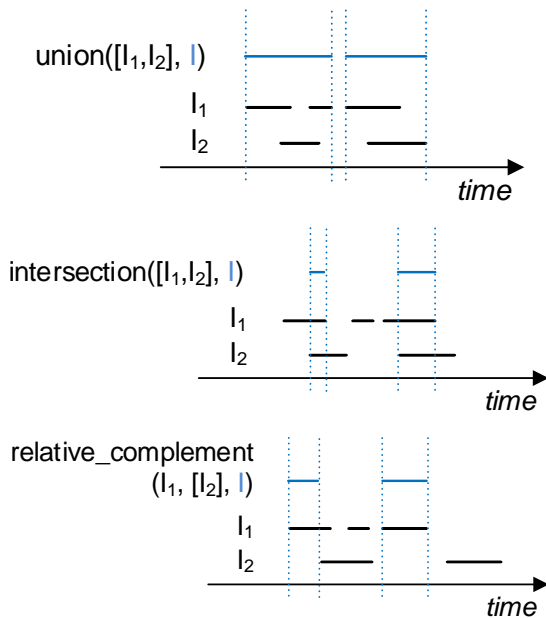
A logic programming implementation of the Event Calculus.

- ▶ **Continuous** narrative assimilation queries on **data streams**.
- ▶ Linear time model, support for multi-valued fluents.
- ▶ Windowing and Forgetting mechanisms.
- ▶ Hierarchies and Caching.

Run-Time Event Calculus (RTEC)

| Predicate | Meaning |
|--|---|
| happensAt (E, T) | Event E occurs at time T |
| initiatedAt ($F = V, T$) | At time T a period of time for which $F = V$ is initiated |
| terminatedAt ($F = V, T$) | At time T a period of time for which $F = V$ is terminated |
| holdsFor ($F = V, I$) | I is the list of the maximal intervals for which $F = V$ holds continuously |
| holdsAt ($F = V, T$) | The value of fluent F is V at time T |
| union_all ($[J_1, \dots, J_n], I$) | $I = (J_1 \cup \dots \cup J_n)$ |
| intersect_all ($[J_1, \dots, J_n], I$) | $I = (J_1 \cap \dots \cap J_n)$ |
| relative_complement_all ($I', [J_1, \dots, J_n], I$) | $I = I' \setminus (J_1 \cup \dots \cup J_n)$ |

Interval Manipulation



Complex Event Definitions in RTEC: Simple Fluents

initiatedAt(CE, T) \leftarrow
happensAt(E_{In_1}, T),
[conditions]

...

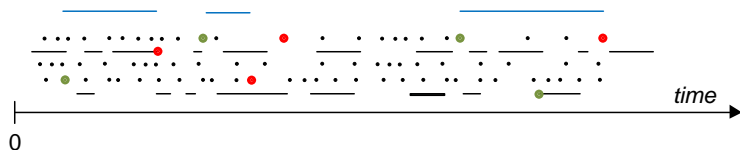
initiatedAt(CE, T) \leftarrow
happensAt(E_{In_i}, T),
[conditions]

terminatedAt(CE, T) \leftarrow
happensAt(E_{T_1}, T),
[conditions]

...

terminatedAt(CE, T) \leftarrow
happensAt(E_{T_j}, T),
[conditions]

Complex Event recognition: **holdsFor**(CE, I)



Complex Event Definitions in RTEC: Simple Fluents

Complex Event definition:

initiatedAt(*leaving_object*(*P*, *Obj*) = true, *T*) ←
 happensAt(*appear*(*Obj*), *T*),
 holdsAt(*inactive*(*Obj*) = true, *T*),
 holdsAt(*close*(*P*, *Obj*) = true, *T*),
 holdsAt(*person*(*P*) = true, *T*)

terminatedAt(*leaving_object*(*P*, *Obj*) = true, *T*) ←
 happensAt(*disappear*(*Obj*), *T*)

Complex Event Definitions in RTEC: Statically Determined Fluents

holdsFor(CE, I) \leftarrow
 holdsFor(F_1, I_{F_1}),
 \dots ,
 holdsFor(F_f, I_{F_f}),
 *interval_manipulation*₁($I_\alpha, \dots, I_\omega$),
 \dots ,
 *interval_manipulation*_k(I_A, \dots, I_Ω)

where

interval_manipulation(I_1, \dots, I_n, I) :
 union($[I_1, \dots, I_n], I$)
 intersection($[I_1, \dots, I_n], I$)
 relative_complement($I_1, [I_2, \dots, I_n], I$)

Complex Event Definitions in RTEC: Statically Determined Fluents

Complex Event definition:

holdsFor(*fighting*(P_1, P_2) = true, l) :-
 holdsFor(*abrupt*(P_1) = true, l_1),
 holdsFor(*abrupt*(P_2) = true, l_2),
 union_all([l_1, l_2], l_3),
 holdsFor(*close*(P_1, P_2) = true, l_4),
 intersect_all([l_3, l_4], l_5),
 holdsFor(*inactive*(P_1) = true, l_6),
 holdsFor(*inactive*(P_2) = true, l_7),
 union_all([l_6, l_7], l_8),
 relative_complement_all($l_5, [l_8], l$).

Simplified Event Calculus (Simplec)

- ▶ Writing Complex Event definitions in RTEC involves:
 - ▶ Event Calculus
 - ▶ Prolog
 - ▶ Thorough knowledge of RTEC's mechanisms
 - ▶ Collaboration between domain experts and programmers
- ▶ Alas, not everyone is keen on (logic) programming!
- ▶ Simplec: Simplified Event Calculus
 - ▶ High level notation
 - ▶ A level of abstraction towards the technical details of RTEC
 - ▶ Addresses domain experts with little (or no) programming skills

SimpleC

SimpleC Statements:

initiate *passenger_density*(*ID*, *VT*) = *Val* **iff**
passenger_density_change(*ID*, *VT*, *Val*).

Equivalent RTEC code:

```
initiatedAt(passenger_density(ID, VT) = Val, T) :-  
  happensAt(passenger_density_change(ID, VT, Val), T).  
simpleFluent(passenger_density(-, -) = high).  
simpleFluent(passenger_density(-, -) = medium).  
simpleFluent(passenger_density(-, -) = low).  
event(passenger_density_change(-, -, -)).  
outputEntity(passenger_density(-, -) = high).  
outputEntity(passenger_density(-, -) = medium).  
outputEntity(passenger_density(-, -) = low).  
inputEntity(passenger_density_change(-, -, -)).
```

SimpleC

SimpleC Statements:

initiate *passenger_density*(*ID*, *VT*) = *Val* **iff**
passenger_density_change(*ID*, *VT*, *Val*).

Equivalent RTEC code:

initiatedAt(*passenger_density*(*ID*, *VT*) = *Val*, *T*) :-
 happensAt(*passenger_density_change*(*ID*, *VT*, *Val*), *T*).
simpleFluent(*passenger_density*(-, -) = *high*).
simpleFluent(*passenger_density*(-, -) = *medium*).
simpleFluent(*passenger_density*(-, -) = *low*).
event(*passenger_density_change*(-, -, -)).
outputEntity(*passenger_density*(-, -) = *high*).
outputEntity(*passenger_density*(-, -) = *medium*).
outputEntity(*passenger_density*(-, -) = *low*).
inputEntity(*passenger_density_change*(-, -, -)).

SimpleC

SimpleC Statements:

initiate *passenger_density*(*ID*, *VT*) = *Val* iff
passenger_density_change(*ID*, *VT*, *Val*).

Equivalent RTEC code:

initiatedAt(*passenger_density*(*ID*, *VT*) = *Val*, *T*) :-
 happensAt(*passenger_density_change*(*ID*, *VT*, *Val*), *T*).
simpleFluent(*passenger_density*(-, -) = *high*).
simpleFluent(*passenger_density*(-, -) = *medium*).
simpleFluent(*passenger_density*(-, -) = *low*).
event(*passenger_density_change*(-, -, -)).
outputEntity(*passenger_density*(-, -) = *high*).
outputEntity(*passenger_density*(-, -) = *medium*).
outputEntity(*passenger_density*(-, -) = *low*).
inputEntity(*passenger_density_change*(-, -, -)).

SimpleEC

SimpleEC Statements:

initiate *person(P)* iff
(**start** *walking(P)* or
start *active(P)* or
start *running(P)* or
start *abrupt(P)*),
not **disappear(P)**.

terminate *person(P)* iff
disappear(P).

Equivalent RTEC code:

initiatedAt(*person(P) = true*, *T*) :-
 happensAt(**start**(*walking(P) = true*), *T*),
 not **happensAt**(*disappear(P)*, *T*).

initiatedAt(*person(P) = true*, *T*) :-
 happensAt(**start**(*active(P) = true*), *T*),
 not **happensAt**(*disappear(P)*, *T*).

initiatedAt(*person(P) = true*, *T*) :-
 happensAt(**start**(*running(P) = true*), *T*),
 not **happensAt**(*disappear(P)*, *T*).

initiatedAt(*person(P) = true*, *T*) :-
 happensAt(**start**(*abrupt(P) = true*), *T*),
 not **happensAt**(*disappear(P)*, *T*).

terminatedAt(*person(P) = true*, *T*) :-
 happensAt(*disappear(P)*, *T*).

simpleFluent(*person(-) = true*).

sDFluent(*walking(-) = true*).

sDFluent(*active(-) = true*).

sDFluent(*running(-) = true*).

sDFluent(*abrupt(-) = true*).

event(*disappear(-)*).

outputEntity(*person(-) = true*).

inputEntity(*walking(-) = true*).

inputEntity(*active(-) = true*).

inputEntity(*running(-) = true*).

inputEntity(*abrupt(-) = true*).

inputEntity(*disappear(-)*).

SimpleC

SimpleC Statements: Equivalent RTEC code:

moving(P_1, P_2) iff
 walking(P_1),
 walking(P_2),
 close(P_1, P_2).

holdsFor(*moving*(P_1, P_2) = true, I) :-
 holdsFor(*walking*(P_1) = true, I_1),
 holdsFor(*walking*(P_2) = true, I_2),
 holdsFor(*close*(P_1, P_2) = true, I_3),
 intersect_all([I_1, I_2, I_3], I).

sDFluent(*moving*(-, -) = true).
sDFluent(*walking*(-) = true).
sDFluent(*close*(-, -) = true).
outputEntity(*moving*(-, -) = true).
inputEntity(*walking*(-) = true).
inputEntity(*close*(-, -) = true).

SimpleC

SimpleC Statements: Equivalent RTEC code:

moving(P_1, P_2) iff
walking(P_1),
walking(P_2),
close(P_1, P_2).

holdsFor(*moving*(P_1, P_2) = true, I) :-
 holdsFor(*walking*(P_1) = true, I_1),
 holdsFor(*walking*(P_2) = true, I_2),
 holdsFor(*close*(P_1, P_2) = true, I_3),
 intersect_all([I_1, I_2, I_3], I).

sDFluent(*moving*(-, -) = true).
sDFluent(*walking*(-) = true).
sDFluent(*close*(-, -) = true).
outputEntity(*moving*(-, -) = true).
inputEntity(*walking*(-) = true).
inputEntity(*close*(-, -) = true).

SimpleC

SimpleC Statements: Equivalent RTEC code:

moving(P_1, P_2) iff
 walking(P_1),
 walking(P_2),
 close(P_1, P_2).

holdsFor(*moving*(P_1, P_2) = true, l) :-
 holdsFor(*walking*(P_1) = true, l_1),
 holdsFor(*walking*(P_2) = true, l_2),
 holdsFor(*close*(P_1, P_2) = true, l_3),
 intersect_all([l_1, l_2, l_3], l).

sDFluent(*moving*(-, -) = true).
sDFluent(*walking*(-) = true).
sDFluent(*close*(-, -) = true).
outputEntity(*moving*(-, -) = true).
inputEntity(*walking*(-) = true).
inputEntity(*close*(-, -) = true).

SimpleC

SimpleC Statements: Equivalent RTEC code:

moving(P_1, P_2) iff
 walking(P_1),
 walking(P_2),
 close(P_1, P_2).

holdsFor(*moving*(P_1, P_2) = true, I) :-
 holdsFor(*walking*(P_1) = true, I_1),
 holdsFor(*walking*(P_2) = true, I_2),
 holdsFor(*close*(P_1, P_2) = true, I_3),
 intersect_all([I_1, I_2, I_3], I).
sDFluent(*moving*(-, -) = true).
sDFluent(*walking*(-) = true).
sDFluent(*close*(-, -) = true).
outputEntity(*moving*(-, -) = true).
inputEntity(*walking*(-) = true).
inputEntity(*close*(-, -) = true).

SimpleEC

SimpleEC Statements:

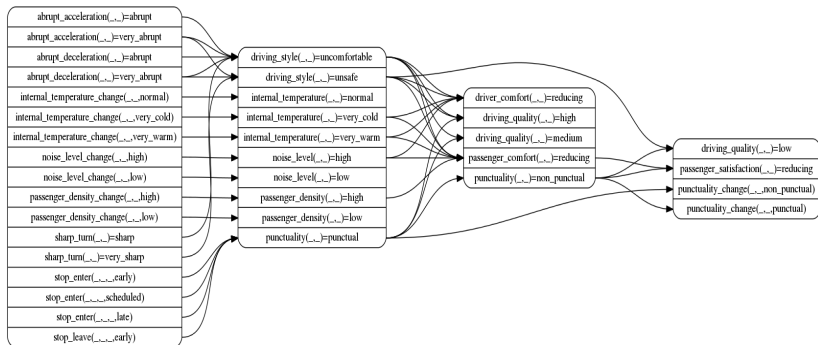
fighting(P_1, P_2) iff
(*abrupt*(P_1) or *abrupt*(P_2)),
close(P_1, P_2),
not (*inactive*(P_1) or *inactive*(P_2)).

Equivalent RTEC code:

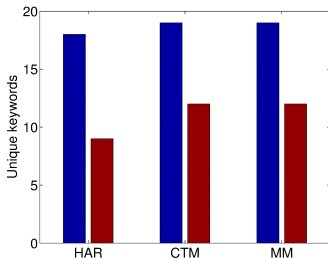
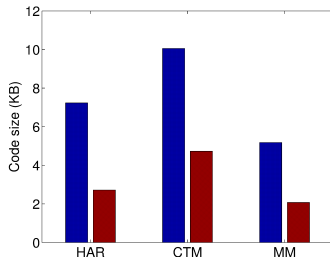
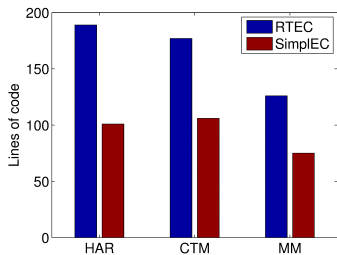
```
holdsFor(fighting( $P_1, P_2$ ) = true,  $I$ ) :-  
  holdsFor(abrupt( $P_1$ ) = true,  $I_1$ ),  
  holdsFor(abrupt( $P_2$ ) = true,  $I_2$ ),  
  union_all( $[I_1, I_2]$ ,  $I_3$ ),  
  holdsFor(close( $P_1, P_2$ ) = true,  $I_4$ ),  
  intersect_all( $[I_3, I_4]$ ,  $I_5$ ),  
  holdsFor(inactive( $P_1$ ) = true,  $I_6$ ),  
  holdsFor(inactive( $P_2$ ) = true,  $I_7$ ),  
  union_all( $[I_6, I_7]$ ,  $I_8$ ),  
  relative_complement_all( $I_5, [I_8], I$ ).  
sDFluent(fighting(-, -) = true).  
sDFluent(abrupt(-) = true).  
sDFluent(close(-, -) = true).  
sDFluent(inactive(-) = true).  
outputEntity(fighting(-, -) = true).  
inputEntity(abrupt(-) = true).  
inputEntity(close(-, -) = true).  
inputEntity(inactive(-) = true).
```

SimpleC: Dependency Graph Generation

City Transport Monitoring:



Evaluation



HAR = Human Activity Recognition
CTM = City Transport Monitoring
MM = Maritime Monitoring

More...

- ▶ RTEC and SimpleC code available on GitHub
 - ▶ <https://github.com/aartikis/RTEC>
- ▶ Future work:
 - ▶ Have SimpleC tested by the domain experts of the datAcron (Big Data Analytics for Time Critical Mobility Forecasting) project – see <http://datacron-project.eu>
 - ▶ Construct simpler and more orderly dependency graphs

Thank you!

Any questions?