



# PENG Light meets the Event Calculus

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## **Motivation**

#### • Research question:

How to extend an existing controlled natural language so that we can specify knowledge about events and their effects (= periods during which states hold)?

#### • Approach:

We look at a scenario where we can observe and describe a sequence of events as they unfold.

• Basically, "eye-witness" reports.

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How to extend an existing controlled natural language so that we can specify knowledge about events and their effects (= periods during which states hold)?

#### • Approach:

We look at a scenario where we observe and describe a sequence of events as they unfold.

- Basically, "eye-witness" reports.
- Think about a spy who observes and reports events as they unfold – if that helps.

# **PENG Light**

- Simple sentences:
  - subject + verb + (complement)\* + (modifier)\*
- Complex sentences:
  - coordination (and, or)
  - subordination (if ... then, who, that, ...)
  - quantification (every, all, for every, ...)
  - negation (no, is not, does not, …)
- Questions:
  - wh-questions
  - yes/no-questions
- Anaphoric references



- PENG Light sentences are translated incrementally during the writing process into first-order logic via discourse representation structures.
- During parsing the following activities occur in parallel:
  - anaphoric expressions are resolved
  - a discourse representation structure is generated
  - a paraphrase is produced
  - lookahead information is generated.
- A model builder tries to generate a finite model.

### Architecture



- John arrives at 10:10 with Flight AZ1777 in Palermo.
- John gets on a bus at the airport.
- The bus leaves the airport at 11:30 and arrives at the port of Trapani at 13:05.
- John gets off the bus in Trapani.

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- Temporal expressions only occur as modifiers of events.

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- The bus <u>leaves</u> the airport at 11:30 and <u>arrives</u> at the port of Trapani at 13:05.
- John <u>gets off</u> the bus in Trapani.
- Temporal structure of these sentences is simple.
- Temporal expressions only occur as modifiers of <u>events</u>.
- These <u>events</u> have a linear temporal ordering.

- John arrives at 10:10 with Flight AZ1777 in Palermo.
- John <u>gets on</u> a bus at the airport.
- The bus leaves the airport at 11:30 and arrives at the port of Trapani at 13:05.
- John <u>gets off</u> the bus in Trapani.
- For some events, no explicit time point is mentioned.

- The weather <u>is bad</u>.
- The wind <u>is strong</u> and the sea <u>is rough</u>.
- We can speak about <u>states</u> in PENG Light.

- If the weather is good then John boards the hydroplane at 14:10 and arrives on Marettimo Island at 15:35.
- If the weather is bad then Johns stays in Trapani and goes to the Albergo Maccotta.
- We can express conditional statements in PENG Light.

# **Question Answering**

- When does John arrive in Palermo?
- Where does John get on a bus?
- When does the bus leave the airport?
- Who gets off the bus?
- These questions can be answered directly over the resulting knowledge base.
- No additional background knowledge is required.

# The Scenario

- John arrives at 10:10 with Flight AZ1777 in Palermo.
- John gets on a bus at the airport.
- The bus leaves the airport at 11:30 and arrives at the port of Trapani at 13:05.
- John gets off the bus in Trapani.

# **Question Answering**

- Where is John now?
- Where is John at 13:30?
- Why does John stay in Trapani?
- These questions require background knowledge.

## Human Observer

- Given:
  - John arrives at 10:10 with Flight AZ1777 in Palermo.
  - John gets on a bus at the airport.
  - The bus leaves the airport at 11:30 ...
- A human observer can easily infer:
  - John is on the bus at 12:00 but not anymore in Palermo at that time.

## Human Observer

- Given:
  - John arrives at 10:10 with Flight AZ1777 in Palermo.
  - John gets on a bus at the airport.
  - The bus leaves the airport at 11:30 and arrives at the port of Trapani at 13:05.
  - John gets off the bus in Trapani.
- A human observer can (easily) infer:
  - John is in Trapani at 13:30 but not anymore on the bus.

# An Event-based Solution

#### Thus

the event of John getting on the bus at a given point in time initiates that John is on the bus

and

the event of John getting off the bus at a given point in time terminates that John is on the bus.

### Architecture



### **Extended Architecture**



#### **Extended Architecture**



# The Event Calculus (EC)

- A framework for reasoning about events and time.
- Many versions exist (Kowalski, Shanahan, Mueller, ...).
- EC has been used for database updates, planning, explanation, hypothetical reasoning.
- The basic entities are: events, fluents and time points.
- Events which occur at a given time point initiate fluents (= properties, states) that hold until they are terminated by other events at a later time point.

# Event Calculus (Simplified Version)

• Only two domain independent clauses are necessary:

```
holds_at(F,T2) :-
happens(E,T1),
before(T1,T2),
initiates(E,F),
\+ clipped(T1,F,T2).
clipped(T1,F,T3) :-
happens(E,T2),
```

- terminates(E,F),
- before(T1,T2),
- before(T2,T3).

# Event Calculus (Simplified Version)

• Domain specific clauses:

```
initiates(E,located_at(X,Y)) :-
    event(E,arriving(X,Y)).
```

```
terminates(E,located_at(X,Y)) :-
    event(E,leaving(X,Y)).
```

# Event Calculus (Simplified Version)

 A particular course of events is represented as a set of happens/2 and event/2 clauses:

```
happens(e1,'10:10').
event(e1,arriving(sk1,sk2)).
happens(e2,'11:30').
event(e2,leaving(sk3,sk4)).
before('10:10','11:30').
```

• The before/2 clause keeps track of the temporal ordering.

# Speaking about Events and Effects

- The initial scenario:
  - John arrives at 10:10 with Flight AZ1777 in Palermo.
  - John gets on a bus at the airport.
  - The bus leaves the airport at 11:30 and arrives at the port of Trapani at 13:05.
  - John gets off the bus in Trapani.

needs to be augmented with domain specific axioms.

# **Domain-Specific Axioms**

- This can be done directly via an extension of PENG Light, for example:
  - If X arrives at Y then this event initiates that X is located at Y.
  - If X gets on Y then this event initiates that X is located in Y.
  - If X is located in Y and Y leaves Z then this event terminates that X is located at Z.

# **Domain-Specific Axioms**

- We can further restrict the domain and the range:
  - If X gets on Y then
    - this event initiates that X is located in Y.
  - If a person gets on a vehicle then this event initiates that the person is located in the vehicle.
- Additionally, we need to specify that:
  - John is a person.
  - Every bus is a vehicle.

## Model Generation

- PENG Light texts are translated into the input language of a Satchmo-style model builder.
- For example:
  - John arrives with Flight AZ1777 at the airport of Palermo at 10:10.
  - John gets on a bus at the airport.

results in in the following model ...

### Model Generation

```
named(sk1,john). theta(e1,theme,sk1).
event(e1, arriving).
theta(e1, instrument, sk2). named(sk2, az1777).
theta(e1,location,sk3).
object(sk3, airport). associated with(sk3, sk4).
named(sk4,palermo).
theta(e1,time,sk5). timex(sk5,'10:10').
theta(e2,agent,sk1).
event(e2,getting on). theta(e2,theme,sk6).
object(sk6,bus).
theta(e2,location,sk3). theta(e2,time,sk7).
timex(sk7,'11:15').
before('10:10','11:15').
```

# Model Generation

- Two things to note:
  - terms are wrapped by the predicate fact/1:

```
fact(named(sk1,john)).
```

- Timestamp for events without temporal modifiers, e.g.:
  - John gets on a bus at the airport.

```
theta(e2,time,sk7).
```

timex(sk7,'11:15').

# Domain-Specific Axioms in PENG Light

• If X arrives at Y then

this event initiates that X is located at Y.

- If X gets on Y then this event initiates that X is located in Y.
- If X is located in Y and Y leaves Z then this event terminates that X is located at Z.

## **Domain Specific Axioms in Prolog**

```
initiates(E,fluent(X,located at,Y)) :-
   event(E,arriving),
   theta(E, theme, X),
   theta(E,location,Y).
initiates(E,fluent(X,located in,Y)) :-
   event(E,getting on),
   theta(E, agent, X),
   theta(E, theme, Y).
terminates(E,fluent(X,located at,Z)) :-
   event(E,leaving),
   theta(E,agent,Y),
   theta(E, theme, Z),
   holds at(fluent(X,located in,Y),now).
```

# Interface between the Model and EC

#### • The following rule:

```
happens(E,T) := event(E,Type), theta(E,time,X), timex(X,T).
sets up the interface between the facts in the model:
    event(e1,arriving). theta(e1,time,sk5). timex(sk5,'10:10').
```

and the domain-independent axioms of the EC:

```
holds_at(F,T2) :-
happens(E,T1), before(T1,T2),
initiates(E,F), \+ clipped(T1,F,T2).
clipped(T1,F,T3) :-
happens(E,T2), terminates(E,F),
before(T1,T2), before(T2,T3).
```

### Reasoning

• Domain-independent axioms:

```
holds_at(F,T2) :-
happens(E,T1),
before(T1,T2),
initiates(E,F),
\+ clipped(T1,F,T2).
```

```
clipped(T1,F,T3) :-
happens(E,T2),
terminates(E,F),
before(T1,T2),
before(T2,T3).
```

### Reasoning

```
initiates(E,fluent(X,located_at,Y)) :-
    event(E,arriving),
    theta(E,theme,X),
    theta(E,location,Y).

terminates(E,fluent(X,located_at,Z)) :-
    event(E,leaving),
    theta(E,agent,Y),
    theta(E,theme,Z),
    holds_at(fluent(X,located_in,Y),now).
```

# Reasoning (Model)

```
named(sk1,john). theta(e1,theme,sk1).
event(e1, arriving).
theta(e1, instrument, sk2). named(sk2, az1777).
theta(e1,location,sk3).
object(sk3, airport). associated with(sk3, sk4).
named(sk4,palermo).
theta(e1,time,sk5). timex(sk5,'10:10').
theta(e2,agent,sk1).
event(e2,getting on). theta(e2,theme,sk6).
object(sk6,bus).
theta(e2,location,sk3). theta(e2,time,sk7).
timex(sk7,'11:15').
before('10:10','11:15').
```

## Reasoning

- Given this knowledge, we can now answer the questions:
  - Where is John at 11:20?
  - Where is John now?

with the help of the Event Calculus and find that John is in the bus at 11:20 and still in Palermo at that time.

# **Abductive Reasoning**

- The EC can be extended in many interesting ways.
- We can combine the EC with a meta-interpreter for abductive reasoning in order to find explanations for *why*-questions.
- Abductive reasoning is inference to the best explanation.
- It is reasoning backwards from the consequent to the antecedent.
- Abductive reasoning is not a valid form of reasoning, but it can suggest plausible hypotheses.

# **Abductive Reasoning**

- Let's assume that we want to know
  - Why does John stay in Trapani?
  - and we know that
    - If the weather is bad then Johns stays in Trapani and goes to the Albergo Maccotta
  - and know also that
    - John stays in Trapani and goes to the Albergo Maccotta.

then we can infer via abduction that the weather must be bad.

# Future Research: Full Event Calculus

• Use of E-KRHyper as model generator:

$HoldsAt(f,t) \leftarrow Initiallyp(f) \land \neg Clipped(0,f,t)$	(EC1)
$HoldsAt(f,t3) \leftarrow$	(EC2)
Happens(a,t1,t2) $\land$ Initiates(a,f,t1) $\land$	
$t_2 \le t_3 \land \neg Clipped(t_1, f, t_3)$	
$Clipped(t1,f,t4) \leftrightarrow$	(EC3)
$\exists$ a,t2,t3 [Happens(a,t2,t3) $\land$ t1 $\leq$ t3 $\land$ t2 $\leq$ t4 $\land$	
[Terminates(a,f,t2) v Releases(a,f,t2)]]	
$\neg$ HoldsAt(f,t) $\leftarrow$ Initially <sub>N</sub> (f) $\land \neg$ Declipped(0,f,t)	(EC4)
$\neg$ HoldsAt(f,t3) $\leftarrow$	(EC5)
Happens(a,t1,t2) $\land$ Terminates(a,f,t1) $\land$	
$t2 \le t3 \land \neg Declipped(t1, f, t3)$	
$Declipped(t1,f,t4) \leftrightarrow$	(EC6)
$\exists$ a,t2,t3 [Happens(a,t2,t3) $\land$ t1 $\leq$ t3 $\land$ t2 $\leq$ t4 $\land$	
[Initiates(a,f,t2) $\lor$ Releases(a,f,t2)]]	
$Happens(a,t1,t2) \rightarrow t1 \leq t2$	(EC7)

# Conclusions

- PENG Light can be extended in a systematic way to speak about events and their effects.
- PENG Light texts are translated automatically into the input language of a model builder.
- The generated model can be used by the Event Calculus for reasoning about events and time.
- This combinations makes PENG Light an interesting specification language for dynamic domains.