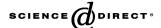


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# Event calculus and temporal action logics compared

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#### Abstract

We compare the event calculus and temporal action logics (TAL), two formalisms for reasoning about action and change. We prove that, if the formalisms are restricted to integer time, inertial fluents, and relational fluents, and if TAL action type specifications are restricted to definite reassignment of a single fluent, then the formalisms are not equivalent. We argue that equivalence cannot be restored by using more general TAL action type specifications. We prove however that, if the formalisms are further restricted to single-step actions, then they are logically equivalent.

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## 1. Introduction

Reasoning about action and change is a fundamental area of research within artificial intelligence. This is an important area because action and change are pervasive aspects of the world in which intelligent agents operate. Over the years, a number of formalisms and frameworks for reasoning about action and change have been developed. Among them are the situation calculus [25,33], the event calculus [19,36], features and fluents [34,35], action languages [7–9], and the fluent calculus [12,41,42].

Although there has been some cross-pollination, the various formalisms have been developed in relative isolation, and the relationship between them is not always well understood. But understanding the relationship between the formalisms is important for the following reasons:

- It helps to advance the field. An understanding of the space of possible formalisms and where each formalism is situated in this space is essential to their refinement.
- It enables sharing of reasoning tools. A number of reasoning tools are available, as shown in Table 1. If problems in one formalism can be translated into another formalism, they can be solved using reasoning tools for the other formalism.
- It enables sharing of problem libraries developed for each of the formalisms and reasoning tools.
- It facilitates collaboration. Researchers working using one formalism can understand and build on the results of researchers using another formalism.

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Tools for reasoning about action and change		
Formalism	Tool	
Situation calculus	KM [3]	
	http://www.cs.utexas.edu/users/mfkb/km.html	
Event calculus	Event calculus planner [39]	
	http://www.iis.ee.ic.ac.uk/~mpsha/planners.html	
	Discrete Event Calculus Reasoner [28]	
	http://decreasoner.sourceforge.net/	
TAL	VITAL [20]	
	http://www.ida.liu.se/~jonkv/vital/	
C+	CCALC [9,23]	
	http://www.cs.utexas.edu/users/tag/cc/	
$\mathcal{E}$	E-RES [14,15]	
	http://www.ucl.ac.uk/~uczcrsm/LanguageE/	
Fluent calculus	FLUX [43]	

Table 1
Tools for reasoning about action and change

Two major streams of research in reasoning about action and change are temporal action logics (TAL) [4–6,21], which has its origins in the features and fluents framework, and the event calculus [29,37]. TAL and the event calculus appear to be similar because they both have characterizations in classical logic and both use linear time. But their exact relationship has been unclear.

http://www.fluxagent.org/

In this paper, we compare the event calculus with support for events with duration [26,37] and TAL 1.0 [4,5]. We start by restricting the event calculus and TAL 1.0 to integer time, inertial fluents, and relational fluents. We further restrict TAL 1.0 action type specifications to definite reassignment of a single fluent. We then prove that these restricted versions are not equivalent. We show that equivalence cannot be restored even if more general TAL action type specifications are used. We then further restrict the two formalisms to single-step actions and prove that these versions are logically equivalent.

#### 2. Past work

In the past, four approaches have been used to compare formalisms for reasoning about action and change:

- (1) Two formalisms are proved to be logically equivalent.
- (2) A syntactic translation is defined from a domain description in one formalism to a domain description in another formalism, and the two domain descriptions are proved to entail the same results. Translations may be provided in one or both directions.
- (3) Semantic (model theoretic) conditions are defined under which a domain description in one formalism matches a domain description in another formalism, and matching domain descriptions are proved to entail the same results.
- (4) A general formalism is defined, and formalisms are shown to be special cases of the general formalism.

In order to ease comparison, the formalisms are often extended or restricted in various ways.

The first approach is used by Kowalski and Sadri [17,18], who consider a version of the event calculus extended with branching time, but without concurrent events, continuous change, and release from the commonsense law of inertia. They show that this version of the event calculus is logically equivalent to a version of the situation calculus similar to that of Reiter [32]. The first approach is also used by Mueller [27], who proves that, if the domain of the timepoint sort is restricted to the integers, the continuous event calculus is logically equivalent to a discrete version of the event calculus.

We use the first approach in this paper.

<sup>&</sup>lt;sup>1</sup> We use the variant of TAL 1.0 in which actions are treated as first-class citizens [5, pp. 19–20].

The second approach is used by a number of researchers. Kartha [16] defines a translation from domain descriptions of action language  $\mathcal{A}$  [8] into three versions of the situation calculus [1,30,31]. He asserts that for any sequence of events, the  $\mathcal{A}$  domain description and the situation calculus translations entail the same truth values of fluents.

Thielscher [40] restricts  $\mathcal{A}$  to a single sequence of actions, and restricts ego world semantics [35] to inertial fluents, relational fluents, and single-step actions. He defines a translation from  $\mathcal{A}$  domain descriptions to ego world semantics domain descriptions, and defines a translation from ego world semantics domain descriptions to  $\mathcal{A}$  domain descriptions. He sketches proofs that in both cases, the models of the domain descriptions entail the same event occurrences and fluent truth values.

Giunchiglia and Lifschitz [11] define a translation from unrestricted domain descriptions of action language  $\mathcal{C}$  [10] into the situation calculus, and define a classical logic translation of the transition semantics of  $\mathcal{C}$  domain descriptions. They prove that for any domain description, the two translations are logically equivalent. They also define a translation from restricted  $\mathcal{C}$  domain descriptions to TAL domain descriptions, and define another classical logic translation of the transition semantics of  $\mathcal{C}$  domain descriptions. They prove that for any domain description, the first translation is a conservative extension of the second translation.

The third approach is used by Miller and Shanahan [26], who consider a version of the  $\mathcal{E}$  action language [13] and a version of the event calculus without release from the commonsense law of inertia, continuous change, and state constraints. They define semantic conditions under which an  $\mathcal{E}$  domain description matches an event calculus domain description. They prove that, if an  $\mathcal{E}$  domain description matches an event calculus domain descriptions entail the same event occurrences and fluent truth values.

The fourth approach is used by Van Belleghem, Denecker, and De Schreye [44], who define a general formalism that encompasses both the situation calculus and a version of the event calculus without concurrent events, continuous change, and release from the commonsense law of inertia. They describe how the situation calculus and this version of the event calculus are obtained by restricting the general formalism.

Bennett and Galton [2] define a versatile event logic (VEL) whose semantics includes a number of formalisms for temporal reasoning, and present ways of describing the situation calculus and the event calculus within VEL. They consider a version of the event calculus without continuous change and release from the commonsense law of inertia.

A related approach is that of Sandewall [35], who defines ontological families and the intended models of a domain description of a given family. The correctness of any particular formalism is then assessed against these formal specifications.

## 3. The event calculus and TAL

How shall we go about proving logical equivalence of the event calculus with events with duration and TAL 1.0? As shown in Table 2, the formalisms do not support the same features. In addition, the formalisms do not address indirect effects and nondeterministic effects using the same language features. Indirect effects are represented in the event calculus using causal constraints and effect constraints [38], whereas they are represented in TAL 1.0 using dependency constraints [5, pp. 16–18]. Nondeterministic effects are represented in the event calculus using determining fluents [37, pp. 419–420], whereas they are represented in TAL 1.0 using disjunctions in reassignment operators [4, pp. 35–36].

At this point, we have two choices. We can either extend the formalisms with their missing features, or we can restrict the formalisms to their common features. We choose the second approach. We disallow causal constraints, continuous change, continuous time, and effect constraints in the event calculus, and we disallow dependency constraints, disjunctions in reassignment operators, durational fluents, and functional fluents in TAL 1.0.

In order to prove logical equivalence, we would like to characterize the event calculus and TAL 1.0 using the same classical language. TAL 1.0 domain descriptions are written in a specialized language  $\mathcal{L}(ND)$  and then translated into a classical language  $\mathcal{L}(FL)$ . The important translation rules are provided in Appendix A. Event calculus domain descriptions are also expressed in a classical language. But TAL 1.0  $\mathcal{L}(FL)$  and the event calculus use different symbol sets. TAL 1.0  $\mathcal{L}(FL)$  uses *Holds*, *Occurs*, and *Occlude*, whereas the event calculus as we have restricted it uses *HoldsAt*, *InitiallyP*, *InitiallyN*, *Happens*, *Initiates*, *Terminates*, *Clipped*, and *Declipped*. How shall we reconcile these two languages?

In TAL 1.0, the effects of events are specified using  $\mathcal{L}(ND)$  action type specifications of the form

$$[\tau, \tau']\alpha \sim \beta$$

reatures of the event calculus and TAL 1.0			
Feature	Event calculus	TAL 1.0	
Causal constraints	✓		
Concurrent events	$\checkmark$	✓	
Context-sensitive effects	$\checkmark$	$\checkmark$	
Continuous change	$\checkmark$		
Continuous time	✓		
Dependency constraints		✓	
Disjunctions in reassignment operators		✓	
Durational fluents		$\checkmark$	
Effect constraints	✓		
Events with duration	$\checkmark$	✓	
Functional fluents		✓	
Inertial fluents	$\checkmark$	✓	
State constraints	$\checkmark$	✓	

Table 2 Features of the event calculus and TAL 1.0

where  $\tau$  and  $\tau'$  are timepoints,  $\alpha$  is an action, and  $\beta$  is a formula that specifies the preconditions and postconditions of  $\alpha$ . Postconditions are defined using the R, X, and I reassignment operators. The R operator specifies that a fluent is released from the commonsense law of inertia during a time interval and is constrained to have a particular value at the end of the interval. The I operator specifies that a fluent is released from the commonsense law of inertia during a time interval and is constrained to have a particular value during the interval. The X operator specifies that a fluent is released from the commonsense law of inertia during a time interval. Note that a fluent released from the commonsense law of inertia by a reassignment operator may be further constrained by other parts of the same action type specification or by different axioms such as state constraints.

The effects of actions are often<sup>2</sup> specified using  $\mathcal{L}(ND)$  action type specifications of the form

$$[\tau, \tau'] \alpha \sim [\tau] \gamma \to R((\tau, \tau'](\neg)\beta) \tag{1}$$

where  $\tau$  and  $\tau'$  are timepoints,  $\alpha$  is an action,  $\gamma$  is a formula, and  $\beta$  is a fluent. This represents that, if  $\alpha$  occurs from  $\tau$  to  $\tau'$ , and  $\gamma$  is true at  $\tau$ , then  $\beta$  will be of indeterminate truth value from  $\tau + 1$  to  $\tau' - 1$  inclusive, and will be true (false) starting at  $\tau'$ . A specification of this form is translated into an  $\mathcal{L}(FL)$  formula

$$Occurs(\tau, \tau', \alpha) \to (\gamma' \to (\neg)Holds(\tau', \beta) \land \forall t(\tau < t \land t \leqslant \tau' \to Occlude(t, \beta)))$$
 (2)

where  $\gamma'$  is the  $\mathcal{L}(FL)$  translation of  $[\tau]\gamma$ . Notice that (2) is logically equivalent to the conjunction of the formulas:

$$Occurs(\tau, \tau', \alpha) \land \gamma' \rightarrow (\neg) Holds(\tau', \beta)$$

$$Occurs(\tau, \tau', \alpha) \land \gamma' \land \tau < t \land t \leqslant \tau' \rightarrow Occlude(t, \beta)$$

In order to reconcile the two languages, we assume that all TAL 1.0 action type specifications are of the form (1). Given this assumption we show in Sections 4 and 6 that the restricted TAL 1.0 is not equivalent to the restricted event calculus. We argue in Section 7 that, even if we relax this assumption and allow more general action type specifications, we still cannot obtain equivalence.

Given this assumption we can express  $[\tau, \tau']\alpha \rightsquigarrow [\tau]\gamma \to R((\tau, \tau']\beta)$  as  $\gamma' \to Initiates(\alpha, \beta, \tau)$ , and  $[\tau, \tau']\alpha \rightsquigarrow [\tau]\gamma \to R((\tau, \tau']\neg\beta)$  as  $\gamma' \to Terminates(\alpha, \beta, \tau)$ , just as in the event calculus. We must then add the following domain-independent axioms to TAL:

$$Occurs(t_1, t_2, e) \land Initiates(e, f, t_1) \rightarrow Holds(t_2, f)$$
 (3)

$$Occurs(t_1, t_2, e) \land Terminates(e, f, t_1) \rightarrow \neg Holds(t_2, f)$$
 (4)

<sup>&</sup>lt;sup>2</sup> 46 of the 68 unique action type specifications provided with the latest release of VITAL, version 2.999.910 alpha of October 8, 2003, are of this form or can be rewritten as several specifications of this form. 8 specifications are of the form  $[\tau, \tau']\alpha \sim [\tau]\gamma \to I((\tau, \tau')[\neg)\beta)$  where  $\beta$  is a durational fluent, 5 specifications involve  $R([\tau'](\neg)\beta)$ , 3 specifications use disjunctions in reassignment operators, and the remaining 6 specifications use other combinations of reassignment operators. Current TAL domains are more complex, but have not yet been added to VITAL.

<sup>3</sup> For example, the  $\mathcal{L}(FL)$  translation of  $[\tau]\beta_1 \land \neg\beta_2$  is  $Holds(\tau,\beta_1) \land \neg Holds(\tau,\beta_2)$ . See Appendix A for more details.

$$(Initiates(e, f, t_1) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e) \land t_1 < t \land t \leqslant t_2 \rightarrow Occlude(t, f)$$
 (5)

Furthermore, we treat the TAL 1.0  $\mathcal{L}(FL)$  predicates Holds(t, f),  $Occurs(t_1, t_2, e)$ , and Occlude(t, f), and the event calculus predicates InitiallyP(f), InitiallyN(f),  $Clipped(t_1, f, t_2)$ , and  $Declipped(t_1, f, t_2)$  as abbreviations.

We use a many-sorted language with equality, with sorts for events, fluents, and timepoints. The domain of the timepoint sort is the integers. The language has the following predicates:

- HoldsAt(f, t): Fluent f is true at timepoint t.
- Happens 3(e,  $t_1$ ,  $t_2$ ): Event e occurs from timepoint  $t_1$  to timepoint  $t_2$ .
- Initiates  $(e, f, t_1)$ : If event e occurs from timepoint  $t_1$  to timepoint  $t_2$ , then fluent f will be true after  $t_2$ .
- Terminates  $(e, f, t_1)$ : If event e occurs from timepoint  $t_1$  to timepoint  $t_2$ , then fluent f will be false after  $t_2$ .

#### 3.1. TALA axiomatization

We use the following axiomatization of the restricted TAL 1.0, which we call TALA. We start with definitions of *Holds* and *Occurs*.

TALA1 
$$Holds(t, f) \stackrel{\text{def}}{\equiv} HoldsAt(f, t)$$
  
TALA2  $Occurs(t_1, t_2, e) \stackrel{\text{def}}{\equiv} Happens3(e, t_1, t_2 - 1)$ 

Note the difference in the ending timepoint  $t_2$  between *Occurs* and *Happens3*.

TAL uses circumscription [22,24] of the *Occlude* and *Occurs* predicates [21, p. 26], just as the event calculus uses circumscription of *Initiates*, *Terminates*, and *Happens* [37, p. 417]. We continue with a definition based on the circumscription of *Occlude* in (5). We compute the circumscription using Proposition 2 of Lifschitz [22], which reduces circumscription to predicate completion.

TALA3 
$$Occlude(t, f) \stackrel{\text{def}}{\equiv} \exists e, t_1, t_2 ((Initiates(e, f, t_1) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e) \land t_1 < t \land t \leqslant t_2)$$

The TAL 1.0 nochange axiom  $\neg Occlude(t+1, f) \rightarrow (Holds(t+1, f) \leftrightarrow Holds(t, f))$  [4, p. 30] is logically equivalent to the conjunction of the axioms TALA4 and TALA5.

TALA4 
$$Holds(t, f) \land \neg Occlude(t + 1, f) \rightarrow Holds(t + 1, f)$$
  
TALA5  $\neg Holds(t, f) \land \neg Occlude(t + 1, f) \rightarrow \neg Holds(t + 1, f)$ 

We continue with formulas (3) and (4).

TALA6 
$$Occurs(t_1, t_2, e) \land Initiates(e, f, t_1) \rightarrow Holds(t_2, f)$$
  
TALA7  $Occurs(t_1, t_2, e) \land Terminates(e, f, t_1) \rightarrow \neg Holds(t_2, f)$ 

We finish with a constraint on the starting and ending timepoints of an event occurrence.

TALA8 
$$Occurs(t_1, t_2, e) \rightarrow t_1 < t_2$$

Let TALA be the formula generated by conjoining axioms TALA4 through TALA8 and then expanding the predicates *Holds*, *Occurs*, and *Occlude* using definitions TALA1 through TALA3.

#### 3.2. ECA axiomatization

There are two versions of the event calculus that support events with duration [26,37]. Both are candidates for equivalence with TAL 1.0. We start by using the following axiomatization of the event calculus. It is obtained from the version of the event calculus of Shanahan [37, p. 416] by eliminating *Releases*, and replacing *InitiallyP*, *InitiallyN*, *Clipped*, and *Declipped* with definitions.

```
ECA1 InitiallyP(f) \stackrel{\text{def}}{\equiv} HoldsAt(f,0)

ECA2 InitiallyN(f) \stackrel{\text{def}}{\equiv} \neg HoldsAt(f,0)

ECA3 Clipped(t_1, f, t_4) \stackrel{\text{def}}{\equiv} \exists e, t_2, t_3 \ (Happens3(e, t_2, t_3) \land t_1 < t_3 \land t_2 < t_4 \land Terminates(e, f, t_2))

ECA4 Declipped(t_1, f, t_4) \stackrel{\text{def}}{\equiv} \exists e, t_2, t_3 \ (Happens3(e, t_2, t_3) \land t_1 < t_3 \land t_2 < t_4 \land Initiates(e, f, t_2))

ECA5 InitiallyP(f) \land \neg Clipped(0, f, t) \rightarrow HoldsAt(f, t)

ECA6 InitiallyN(f) \land \neg Declipped(0, f, t) \rightarrow \neg HoldsAt(f, t)

ECA7 Happens3(e, t_1, t_2) \land Initiates(e, f, t_1) \land t_2 < t_3 \land \neg Clipped(t_1, f, t_3) \rightarrow HoldsAt(f, t_3)

ECA8 Happens3(e, t_1, t_2) \land Terminates(e, f, t_1) \land t_2 < t_3 \land \neg Declipped(t_1, f, t_3) \rightarrow \neg HoldsAt(f, t_3)

ECA9 Happens3(e, t_1, t_2) \rightarrow t_1 \leqslant t_2
```

Let ECA be the formula generated by conjoining axioms ECA5 through ECA9 and then expanding the predicates *InitiallyP*, *InitiallyN*, *Clipped*, and *Declipped* using definitions ECA1 through ECA4.

We can now proceed to our first result.

# 4. Lack of equivalence between TALA and ECA

In this section, we expose two differences between TALA and ECA. The first difference involves an occurrence of an event that initiates a fluent, followed by another occurrence of an event that initiates the same fluent. In TALA, the fluent is of indeterminate truth value within the durations of both event occurrences, whereas in ECA, it is only of indeterminate truth value within the duration of the first event occurrence. Within the duration of the second event occurrence, the fluent is true, because it was previously initiated and has not been clipped.

# **Theorem 1.** TALA $\not\models$ ECA.

**Proof.** Consider the following structure *S*:

$$Initiates = \{ \langle \mathbf{I}, \mathbf{F}, 1 \rangle, \langle \mathbf{I}, \mathbf{F}, 4 \rangle \}$$
 (6)

$$Terminates = \emptyset$$
 (7)

$$\mathbf{Happens3} = \{ \langle \mathbf{I}, 1, 2 \rangle, \langle \mathbf{I}, 4, 5 \rangle \} \tag{8}$$

$$\mathbf{HoldsAt} = \{ \langle \mathbf{F}, 3 \rangle, \langle \mathbf{F}, 4 \rangle, \langle \mathbf{F}, 6 \rangle, \langle \mathbf{F}, 7 \rangle, \langle \mathbf{F}, 8 \rangle, \ldots \}$$

We can show  $S \models TALA$  but  $S \not\models ECA$ . It is straightforward to verify  $S \models TALA$ . In order to show  $S \not\models ECA$ , it is sufficient to show  $S \not\models ECA$ 7. Moreover, we need only show

$$S \not\models Happens3(I, 1, 2) \land Initiates(I, F, 1) \land 2 < 5 \land \neg Clipped(1, F, 5) \rightarrow HoldsAt(F, 5)$$
 (10)

From (7), we have

$$S \models \neg \exists e, t_2, t_3(Happens3(e, t_2, t_3) \land 1 < t_3 \land t_2 < 5 \land Terminates(e, F, t_2))$$

From this and definition ECA3, we have  $S \models \neg Clipped(1, F, 5)$ . From this, (8), and (6), we have

$$S \models Happens3(I, 1, 2) \land Initiates(I, F, 1) \land 2 < 5 \land \neg Clipped(1, F, 5)$$

But from (9), we have  $S \models \neg HoldsAt(F, 5)$ . Therefore, we have (10).  $\Box$ 

The second difference between TALA and ECA involves an occurrence of an event that initiates a fluent, which overlaps in time an occurrence of an event that terminates the same fluent. In TALA, the fluent is true at the end of the initiating event occurrence, whereas in ECA, the fluent is of indeterminate truth value at the end of the initiating event occurrence.

# **Theorem 2.** ECA $\not\models$ TALA.

**Proof.** Consider the following structure *S*:

$$Initiates = \{\langle \mathbf{I}, \mathbf{F}, 1 \rangle\}$$
 (11)

$$Terminates = \{ \langle T, F, 2 \rangle \}$$
 (12)

$$\mathbf{Happens3} = \{ \langle \mathbf{I}, 1, 2 \rangle, \langle \mathbf{T}, 2, 3 \rangle \} \tag{13}$$

$$HoldsAt = \emptyset$$
 (14)

We can show  $S \models \text{ECA}$  but  $S \not\models \text{TALA}$ . It is straightforward to verify  $S \models \text{ECA}$ . In order to show  $S \not\models \text{TALA}$ , it is sufficient to show  $S \not\models \text{TALA6}$ . Furthermore, we need only show

$$S \not\models Occurs(1,3,I) \land Initiates(I,F,1) \rightarrow Holds(3,F)$$
 (15)

From (13), definition TALA2, and (11), we have  $Occurs(1,3,I) \land Initiates(I,F,1)$ . But from (14) and definition TALA1, we have  $S \models \neg Holds(3,F)$ . Therefore, we have (15).  $\Box$ 

Thus we have lack of equivalence.

**Corollary 3.** TALA is not logically equivalent to ECA.

**Proof.** This follows from either Theorem 1 or Theorem 2.  $\Box$ 

#### 5. ECB axiomatization

A second axiomatization of the event calculus that supports events with duration is provided by Miller and Shanahan [26, pp. 470–471]. After rewriting it in the style of ECA, it is as follows.

```
ECB1 Clipped'(t_1, f, t_4) \stackrel{\text{def}}{=} \exists e, t_2, t_3 (Happens3(e, t_2, t_3) \land t_1 \leqslant t_3 \land t_2 < t_4 \land Terminates(e, f, t_2))
```

ECB2  $Declipped'(t_1, f, t_4) \stackrel{\text{def}}{=} \exists e, t_2, t_3 (Happens 3(e, t_2, t_3) \land t_1 \leqslant t_3 \land t_2 < t_4 \land Initiates(e, f, t_2))$ 

ECB3  $Clipped(t_1, f, t_4) \stackrel{\text{def}}{\equiv} \exists e, t_2, t_3 (Happens 3(e, t_2, t_3) \land t_1 < t_3 \land t_2 < t_4 \land Terminates(e, f, t_2))$ 

ECB4  $Declipped(t_1, f, t_4) \stackrel{\text{def}}{\equiv} \exists e, t_2, t_3 (Happens3(e, t_2, t_3) \land t_1 < t_3 \land t_2 < t_4 \land Initiates(e, f, t_2))$ 

ECB5  $HoldsAt(f, t_1) \wedge t_1 < t_2 \wedge \neg Clipped'(t_1, f, t_2) \rightarrow HoldsAt(f, t_2)$ 

ECB6  $\neg HoldsAt(f, t_1) \land t_1 < t_2 \land \neg Declipped'(t_1, f, t_2) \rightarrow \neg HoldsAt(f, t_2)$ 

ECB7  $Happens3(e, t_1, t_2) \land Initiates(e, f, t_1) \land t_2 < t_3 \land \neg Clipped(t_1, f, t_3) \rightarrow HoldsAt(f, t_3)$ 

ECB8  $Happens3(e, t_1, t_2) \land Terminates(e, f, t_1) \land t_2 < t_3 \land \neg Declipped(t_1, f, t_3) \rightarrow \neg HoldsAt(f, t_3)$ 

ECB9 *Happens3* $(e, t_1, t_2) \rightarrow t_1 \leqslant t_2$ 

ECB differs from ECA in the following ways:

- It eliminates the definitions of *InitiallyP* and *InitiallyN*.
- It add definitions of Clipped' and Declipped'.
- It adds the axioms of inertia ECB5 and ECB6.

Let ECB be the formula generated by conjoining axioms ECB5 through ECB9 and then expanding the predicates *Clipped'*, *Declipped'*, *Clipped*, and *Declipped* using definitions ECB1 through ECB4.

We then have our second result.

## 6. Lack of equivalence between TALA and ECB

ECB is not equivalent to TALA, for the two reasons previously given for ECA, as well as the following reason. Consider a single occurrence of an event that initiates a fluent. Within the duration of the event occurrence, the fluent is of indeterminate truth value in TALA, whereas in ECB a fluent that is true persists in each model because of the

frame axiom ECB5. That is, if in a given model the fluent is true at any given timepoint within an event occurrence, then it is true for all remaining timepoints within the event occurrence.

## **Theorem 4.** TALA $\not\models$ ECB.

**Proof.** Consider the following structure *S*:

$$Initiates = \{\langle \mathbf{I}, \mathbf{F}, 1 \rangle\}$$
 (16)

$$Terminates = \emptyset$$
 (17)

$$\mathbf{Happens3} = \{ \langle \mathbf{I}, 1, 3 \rangle \} \tag{18}$$

$$\mathbf{HoldsAt} = \{ \langle \mathbf{F}, 2 \rangle, \langle \mathbf{F}, 4 \rangle, \langle \mathbf{F}, 5 \rangle, \langle \mathbf{F}, 6 \rangle, \dots \}$$
 (19)

We can show  $S \models TALA$  but  $S \not\models ECB$ . It is straightforward to verify  $S \models TALA$ . In order to show  $S \not\models ECB$ , it is sufficient to show  $S \not\models ECB5$ . Moreover, we need only show

$$S \not\models HoldsAt(F, 2) \land 2 < 3 \land \neg Clipped'(2, F, 3) \rightarrow HoldsAt(F, 3)$$

$$\tag{20}$$

From (17), we have

$$S \models \neg \exists e, t_2, t_3 (Happens3(e, t_2, t_3) \land 2 \leqslant t_3 \land t_2 < 3 \land Terminates(e, F, t_2))$$

From this and definition ECB1, we have  $S \models \neg Clipped'(2, F, 3)$ . From this and (19), we have

$$S \models HoldsAt(F, 2) \land 2 < 3 \land \neg Clipped'(2, F, 3)$$

But from (19), we have  $S \models \neg HoldsAt(F, 3)$ . Therefore, we have (20).  $\Box$ 

**Corollary 5.** TALA is not logically equivalent to ECB.

**Proof.** This follows from Theorem 4.  $\Box$ 

# 7. General action type specifications

We have shown that, if TAL action type specifications are of the form (1), then TAL and the event calculus are not equivalent. What if we use a more general form of action type specification? Can we restore equivalence with the event calculus?

The answer is no. It is sufficient to show that the difference highlighted in the proof of Theorem 2 cannot be erased. ECA7 (as well as ECB7, which is identical) entails that, if a fluent is not clipped during an event occurrence that initiates the fluent, then the fluent is true at the end of the event occurrence. Action type specifications of the form (1) entail that the fluent is always true at the end of the event. We would like to add to the action type specification the condition that the fluent is not clipped:

$$[t_1, t_2]I \rightsquigarrow \neg \exists t_3, t_4[[t_3, t_4]T \land t_1 < t_4 - 1 \land t_3 < t_2] \rightarrow R([t_2]F)$$

(I and T are actions, and F is a fluent.) Unfortunately, the consequent of an action type specification cannot contain action occurrence statements such as  $[t_3, t_4]T$  [4, p. 28].

The underlying difficulty is that TAL does not have the notions of clipped and declipped. In order for TAL to emulate the event calculus with events with duration, it would have to be extended with these notions.

## 8. Restriction to single-step actions

We now consider what happens if we restrict TAL and the event calculus to single-step actions. We add TALA9 to TALA:

TALA1 
$$Holds(t, f) \stackrel{\text{def}}{\equiv} HoldsAt(f, t)$$
  
TALA2  $Occurs(t_1, t_2, e) \stackrel{\text{def}}{\equiv} Happens3(e, t_1, t_2 - 1)$ 

```
TALA3 Occlude(t, f) \stackrel{\text{def}}{\equiv} \exists e, t_1, t_2((Initiates(e, f, t_1) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e) \land t_1 < t \land t \leqslant t_2) TALA4 Holds(t, f) \land \neg Occlude(t + 1, f) \rightarrow Holds(t + 1, f) TALA5 \neg Holds(t, f) \land \neg Occlude(t + 1, f) \rightarrow \neg Holds(t + 1, f) TALA6 Occurs(t_1, t_2, e) \land Initiates(e, f, t_1) \rightarrow Holds(t_2, f) TALA7 Occurs(t_1, t_2, e) \land Terminates(e, f, t_1) \rightarrow \neg Holds(t_2, f) TALA8 Occurs(t_1, t_2, e) \rightarrow t_1 < t_2 TALA9 Occurs(t_1, t_2, e) \rightarrow t_2 = t_1 + 1
```

Let TALAS be the formula generated by conjoining axioms TALA4 through TALA9 and then expanding the predicates *Holds, Occurs*, and *Occlude* using definitions TALA1 through TALA3.

For single-step actions, the version of the event calculus that appears to be the most similar to TAL is the discrete event calculus (DEC) [27,29]. DEC was developed to improve the efficiency of automated reasoning in the event calculus. It improves efficiency by limiting time to the integers, and eliminating triply quantified time from many of the axioms. Mueller [27] proves that, for integer time and single-step events, DEC is logically equivalent to an extended version of ECB [26].

The following axiomatization is obtained from the full version of DEC by eliminating *Trajectory*, *AntiTrajectory*, *Releases*, and *ReleasedAt*.

```
DECA1 Happens(e,t) \stackrel{\text{def}}{=} Happens3(e,t,t)

DECA2 HoldsAt(f,t) \land \neg \exists e(Happens(e,t) \land Terminates(e,f,t)) \rightarrow HoldsAt(f,t+1)

DECA3 \neg HoldsAt(f,t) \land \neg \exists e(Happens(e,t) \land Initiates(e,f,t)) \rightarrow \neg HoldsAt(f,t+1)

DECA4 Happens(e,t) \land Initiates(e,f,t) \rightarrow HoldsAt(f,t+1)

DECA5 Happens(e,t) \land Terminates(e,f,t) \rightarrow \neg HoldsAt(f,t+1)

DECA6 Happens3(e,t_1,t_2) \rightarrow t_1 = t_2
```

Let DECA be the formula generated by conjoining axioms DECA2 through DECA6 and then expanding the predicate *Happens* using definition DECA1.

We then obtain our final result.

## 9. Equivalence of TALAS and DECA

We can show that TALAS and DECA are logically equivalent. First, we prove a number of lemmas.

**Lemma 6.** TALAS  $\models$  DECA2.

**Proof.** Suppose TALAS. Let f be an arbitrary fluent and t be an arbitrary timepoint. We must show  $HoldsAt(f, t) \land \exists e(Happens(e, t) \land Terminates(e, f, t)) \rightarrow HoldsAt(f, t + 1)$ . Suppose

$$HoldsAt(f,t)$$
 (21)

$$\neg \exists e(Happens(e, t) \land Terminates(e, f, t))$$
 (22)

We consider two cases.

Case 1:  $\exists e(Happens(e, t) \land Initiates(e, f, t)).$ 

From definition DECA1, TALA2, and existential instantiation, we get  $Occurs(t, t + 1, E) \land Initiates(E, f, t)$  for some E. From this, TALA6, and TALA1, we have HoldsAt(f, t + 1), as required.

```
Case 2: \neg \exists e(Happens(e, t) \land Initiates(e, f, t)).
```

From (22), definition DECA1, and TALA2, we get

```
\neg \exists e((Initiates(e, f, t) \lor Terminates(e, f, t)) \land Occurs(t, t + 1, e))
```

Therefore,

$$t_1 = t \land t_2 = t_1 + 1 \rightarrow \neg ((Initiates(e, f, t_1) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e))$$
(23)

From TALA9, by contraposition, we get  $t_2 \neq t_1 + 1 \rightarrow \neg Occurs(t_1, t_2, e)$ . Hence,

$$t_2 \neq t_1 + 1 \rightarrow \neg((Initiates(e, f, t_1) \vee Terminates(e, f, t_1)) \wedge Occurs(t_1, t_2, e))$$

From this and (23), we have

$$t_2 \neq t_1 + 1 \lor t_1 = t \rightarrow \neg ((Initiates(e, f, t_1) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e))$$
 (24)

We can show

$$t_1 < t + 1 \land t + 1 \le t_2 \to t_2 \neq t_1 + 1 \lor t_1 = t$$
 (25)

which is logically equivalent to  $t_1 < t + 1 \land t + 1 \le t_2 \land t_2 = t_1 + 1 \rightarrow t_1 = t$ . To see this, suppose

$$t_1 < t + 1 \tag{26}$$

$$t+1 \leqslant t_2 \tag{27}$$

$$t_2 = t_1 + 1 \tag{28}$$

From (27) and (28), we get  $t \le t_1$ . From this and (26), we have  $t_1 = t$ , as required.

From (25) and (24), we have

$$t_1 < t + 1 \land t + 1 \le t_2 \rightarrow \neg((Initiates(e, f, t_1)) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e))$$
 (29)

From this and TALA3, we get  $\neg Occlude(t+1, f)$ . From this, (21), TALA1, and TALA4, we have HoldsAt(f, t+1), as required.  $\Box$ 

# **Lemma 7.** TALAS $\models$ DECA3.

**Proof.** The proof is identical to that of Lemma 6, except that  $\neg HoldsAt$  is substituted for HoldsAt, Initiates and Terminates are swapped, TALA7 is substituted for TALA6, and TALA5 is substituted for TALA4.  $\Box$ 

#### **Lemma 8.** TALAS $\models$ DECA4.

**Proof.** Suppose TALAS. Let e be an arbitrary event, f be an arbitrary fluent, and t be an arbitrary timepoint. We must show  $Happens(e,t) \land Initiates(e,f,t) \rightarrow HoldsAt(f,t+1)$ . Suppose  $Happens(e,t) \land Initiates(e,f,t)$ . From Happens(e,t), definition DECA1, and TALA2, we get Occurs(t,t+1,e). From this, Initiates(e,f,t), TALA6, and TALA1, we have HoldsAt(f,t+1).  $\square$ 

#### **Lemma 9.** TALAS $\models$ DECA5.

**Proof.** The proof is identical to that of Lemma 8, except that  $\neg HoldsAt$  is substituted for HoldsAt, Terminates is substituted for Initiates, and TALA7 is substituted for TALA6.  $\Box$ 

# **Lemma 10.** TALAS $\models$ DECA6.

**Proof.** This follows from TALA9 and TALA2.  $\Box$ 

Now we consider the other direction.

## **Lemma 11.** DECA $\models$ TALA4.

**Proof.** Suppose DECA. Let f be an arbitrary fluent and t be an arbitrary timepoint. We must show  $Holds(t, f) \land \neg Occlude(t+1, f) \rightarrow Holds(t+1, f)$ . Suppose

$$Holds(t, f)$$
 (30)

$$\neg Occlude(t+1,f) \tag{31}$$

From (31) and definition TALA3, we have

```
\neg \exists e, t_1, t_2((Initiates(e, f, t_1) \lor Terminates(e, f, t_1)) \land Occurs(t_1, t_2, e) \land t_1 < t + 1 \land t + 1 \leqslant t_2)
```

Hence,  $\neg \exists e(Terminates(e, f, t) \land Occurs(t, t + 1, e))$ . From this, definition TALA2, and DECA1, we get  $\neg \exists e$  ( $Happens(e, t) \land Terminates(e, f, t)$ ). From this, (30), definition TALA1, and DECA2, we have Holds(t + 1, f), as required.  $\Box$ 

**Lemma 12.** DECA  $\models$  TALA5.

**Proof.** The proof is identical to that of Lemma 11, except that  $\neg Holds$  is substituted for Holds, Initiates and Terminates are swapped, and DECA3 is substituted for DECA2.  $\Box$ 

**Lemma 13.** DECA  $\models$  TALA6.

**Proof.** Suppose DECA. Let e be an arbitrary event, f be an arbitrary fluent, and  $t_1$  and  $t_2$  be arbitrary timepoints. We must show  $Occurs(t_1, t_2, e) \land Initiates(e, f, t_1) \rightarrow Holds(t_2, f)$ . Suppose  $Occurs(t_1, t_2, e) \land Initiates(e, f, t_1)$ . From  $Occurs(t_1, t_2, e)$  and definition TALA2, we have  $Happens3(e, t_1, t_2 - 1)$ . From this and DECA6, we get  $t_2 = t_1 + 1$ . From this,  $Happens3(e, t_1, t_2 - 1)$ , and DECA1, we have  $Happens(e, t_1)$ . From this,  $Initiates(e, f, t_1)$ , DECA4, and definition TALA1, we get  $Holds(t_1 + 1, f)$ . From this and  $t_2 = t_1 + 1$ , we have  $Holds(t_2, f)$ .  $\square$ 

**Lemma 14.** DECA  $\models$  TALA7.

**Proof.** The proof is identical to that of Lemma 13, except that  $\neg Holds$  is substituted for *Holds*, *Terminates* is substituted for *Initiates*, and DECA5 is substituted for DECA4.  $\Box$ 

**Lemma 15.** DECA  $\models$  TALA8.

**Proof.** This follows from definition TALA2 and DECA6. □

**Lemma 16.** DECA  $\models$  TALA9.

**Proof.** This follows from definition TALA2 and DECA6.  $\Box$ 

Now we proceed to the equivalence theorem.

**Theorem 17.** TALAS is logically equivalent to DECA.

**Proof.** We prove the two directions separately.

(TALAS  $\models$  DECA) Suppose TALAS. Then DECA2, DECA3, DECA4, DECA5, and DECA6 follow from Lemmas 6, 7, 8, 9, and 10, respectively.

(DECA  $\models$  TALAS) Suppose DECA. Then TALA4, TALA5, TALA6, TALA7, TALA8, and TALA9 follow from Lemmas 11, 12, 13, 14, 15, and 16, respectively.  $\Box$ 

#### 10. Conclusions

We have investigated the relationship between the event calculus and TAL. We started by restricting both formalisms to their common features, and found that the resulting versions of the formalisms are not equivalent. We then further restricted the event calculus and TAL to single-step actions, and proved that these versions are logically equivalent.

Some areas for further work are the following:

• Lesser restrictions than the restriction to single-step actions could be explored. It may be possible to show a form of equivalence between TAL and the event calculus with events with duration if there are no overlapping events.

- Hybrids of the event calculus and TAL could be created.
- The relationships between other pairs of formalisms for reasoning about action and change could be explored. Correspondences could be developed between the event calculus and action language C+, and between the situation calculus and temporal action logics.

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## Appendix A. Translation from TAL 1.0 $\mathcal{L}(ND)$ to $\mathcal{L}(FL)$

The important translation rules from TAL 1.0  $\mathcal{L}(ND)$  to  $\mathcal{L}(FL)$  are as follows [5, pp. 6–9]:

- If  $\alpha$  is an action occurrence statement, then  $Trans(\alpha \leadsto \beta) = Trans(\alpha) \to Trans(\beta)$ . If disjunction  $(\vee)$  is used in  $\beta$ , it must be in the scope of an R, I, or X reassignment operator so that circumscription of *Occlude* can be computed using predicate completion [22].
- If  $\alpha$  is an action, then  $Trans([\tau, \tau']\alpha) = Occurs(\tau, \tau', \alpha)$ .
- $Trans(R((\tau, \tau' | \alpha)) = Trans(X((\tau, \tau' | \alpha) \wedge [\tau' | \alpha)).$
- $Trans(R([\tau]\alpha)) = Trans(X([\tau]\alpha) \wedge [\tau]\alpha)$ .
- $Trans(I((\tau, \tau' | \alpha)) = Trans(X((\tau, \tau' | \alpha) \wedge (\tau, \tau' | \alpha)))$
- $Trans(X((\tau, \tau']\alpha)) = \forall t(\tau < t \land t \leqslant \tau' \rightarrow Trans(X([t]\alpha))).$
- $Trans(X([\tau] \neg \alpha)) = Trans(X([\tau]\alpha)).$
- If  $\otimes \in \{\land, \lor, \rightarrow, \leftrightarrow\}$ , then  $Trans(X([\tau]\alpha \otimes \beta)) = Trans(X([\tau]\alpha)) \wedge Trans(X([\tau]\beta))$ .
- If  $Q \in \{\exists, \forall\}$ , then  $Trans(X([\tau]Q\nu[\alpha])) = Q\nu(Trans(X([\tau]\alpha)))$ .
- If  $\alpha$  is a fluent, then  $Trans(X([\tau]\alpha)) = Occlude(\tau, \alpha)$ .
- $Trans([\tau] \neg \alpha) = \neg Trans([\tau] \alpha)$ .
- If  $\otimes \in \{\land, \lor, \to, \leftrightarrow\}$ , then  $Trans([\tau]\alpha \otimes \beta) = Trans([\tau]\alpha) \otimes Trans([\tau]\beta)$ .
- If  $Q \in \{\exists, \forall\}$ , then  $Trans([\tau]Qv[\alpha]) = Qv(Trans([\tau]\alpha))$ .
- If  $\alpha$  is a fluent, then  $Trans([\tau]\alpha) = Holds(\tau, \alpha)$ .

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