

# On the Partial Observability of Temporal Uncertainty

Michael D. Moffitt  
AAAI 2007

---

# Outline

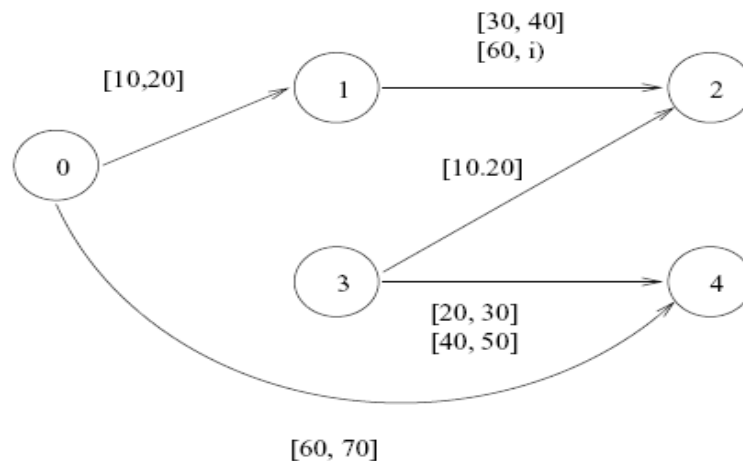
- Introduction
- Background
- Shared Temporal Causality
- The Partially Observable STPU
- Algorithms for Dynamic Controllability
- Conclusion and Future Work

# Introduction

- Uncertainty in constraint-based temporal reasoning: time points are divided into controllable and uncontrollable events.
- Prior studies of uncertainty in Temporal CSPs have required a direct correspondence between observation of an event and its actual execution.
- The author propose an extension to the Simple Temporal Problem with Uncertainty, in which the agent is made aware of only a subset of uncontrollable time points.

# Background 1/5

## Simple Temporal Problem (STP)

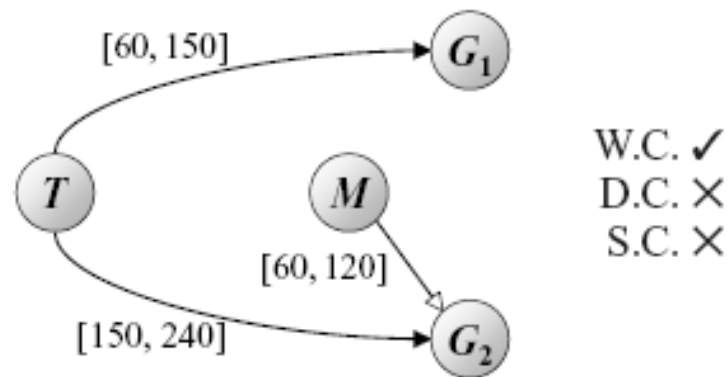


The “Jon and Fred travel to work” Example

- **Definition:** a pair  $\langle X, E \rangle$ ,  $X_i$ : time point,  $E_{ij}$ : constraint
- **Graph-based encoding**
- **Consistency:** no negative cycles
- **Algorithm:** Floyd-Warshall, polynomial time

# Background 2/5

## The running example



T: current time

G1: guest 1 arrive

G2: guest 2 arrive

M: medication

Figure 1: The network corresponding to Example 1.

**Example 1:** Mrs. Smith is expecting two family members to visit for dinner. The first guest will arrive in 1 to 2.5 hrs; the second guest will arrive in 2.5 to 4 hrs. Mrs. Smith must take medication 1 to 2 hrs prior to dinner.

# Background 3/5

## Simple Temporal Problems with Uncertainty (STPU)

- Extension to STP to deal with uncertainty
- Defined by  $\langle X_c, X_u, E, C \rangle$
- **X<sub>c</sub>**: controllable time points, **M**
- **X<sub>u</sub>**: uncontrollable time points, **G<sub>1</sub>, G<sub>2</sub>**
- **E**: requirement links, **M- $\rightarrow$ G<sub>2</sub>**
- **C**: contingent links, **E- $\rightarrow$ G<sub>1</sub>, E- $\rightarrow$ G<sub>2</sub>**

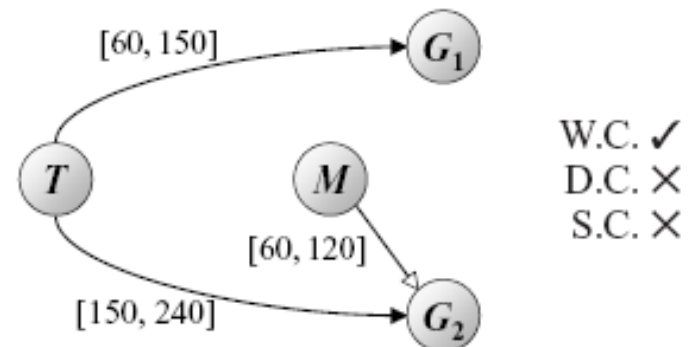


Figure 1: The network corresponding to Example 1.

# Background 4/5

## Controllability of STPU

- **Weak Controllability:** for every possible projection, there must exist a consistent solution.
- **Strong Controllability:** there exists a single consistent solution that satisfies every possible projection.
- **Dynamic Controllability:** there exists a strategy that depends on the outcomes of only those uncontrollable events occurred in the past.

Dynamic controllability is computable in  $O(N^4)$ -time. (Morris 2006)

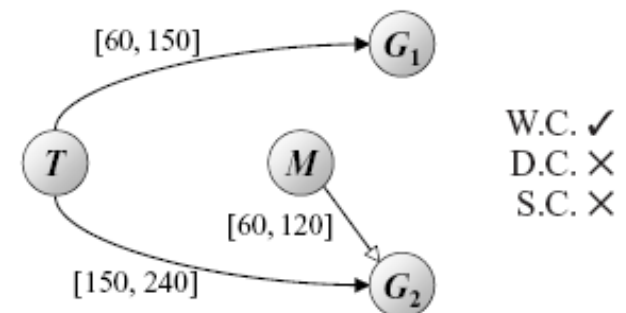


Figure 1: The network corresponding to Example 1.

# Shared Temporal Causality 1/3

- Example 2:** Uncertainty was due to unknown traffic conditions. Considering the routes both guests take, we can expect the second guest arrive between 1.5 to 2.5 hrs after the first.

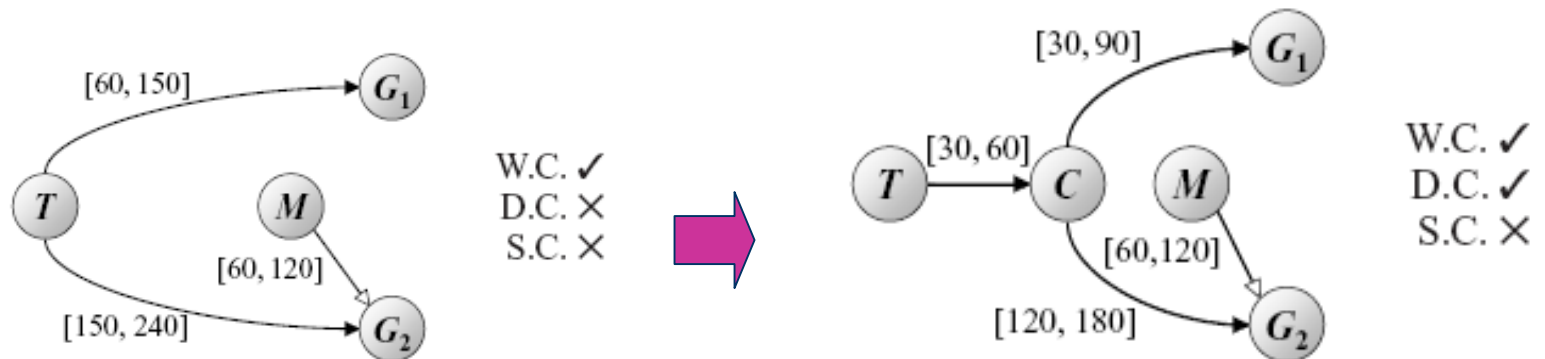


Figure 1: The network corresponding to Example 1.

Figure 2: A common causal process has been factored into the contingent link  $T \Rightarrow C$ .

$T \rightarrow C$ : a common contingent process



# Shared Temporal Causality 2/3

- By analysis of the subnetwork (C, M, G<sub>2</sub>), we can infer a lower and upper bound on C→M:  $[\text{ub}(G_2-C) - \text{ub}(G_2-M), \text{lb}(G_2-C) - \text{lb}(G_2-M)] = [60, 60]$
- So Example 2 is dynamically controllable with the strategy  $M=C+60$ .
- A subtle fault: Our plan cannot depend on C, since C's corresponding causal process is hidden from view.

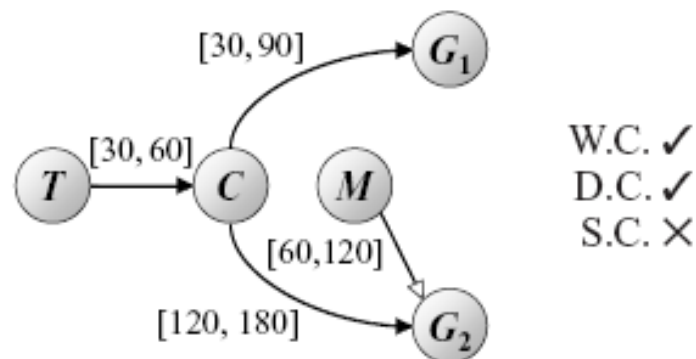


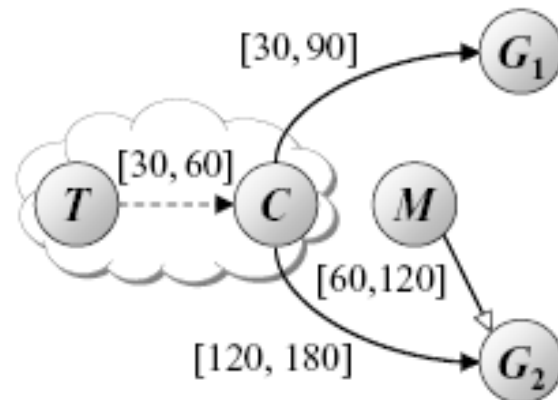
Figure 2: A common causal process has been factored into the contingent link  $T \Rightarrow C$ .

# Shared Temporal Causality 3/3

- Another Hidden Temporal Causality example:  
Deep Space One (DS1) spacecraft controlled by the New Millennium Remote Agent (NUMA)—one of the earliest applications of temporal reasoning with uncertainty.  
(Muscettola, 1998)
- Need to seek a relaxation to the STPU that can accommodate partial observability.

# Partially Observable STPU 1/2

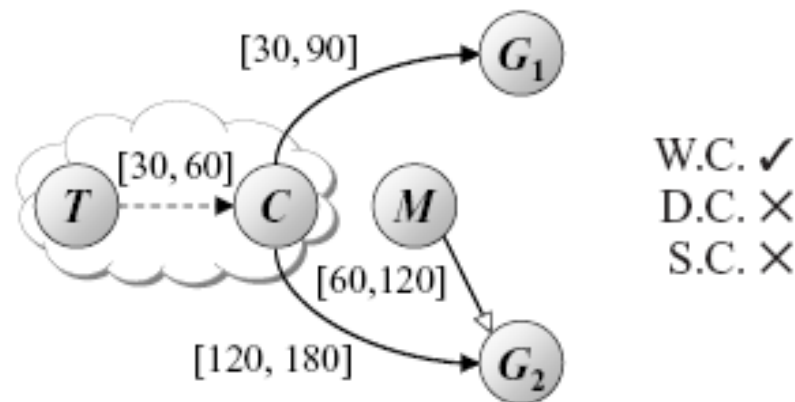
- Extension to the STPU to deal with partial observability.
- Defined as  $\langle X_c, X_o, X_u, E, C_o, C_u \rangle$
- **X<sub>c</sub>**: controllable
- **X<sub>o</sub>**: observable uncontrollable
- **X<sub>u</sub>**: unobservable uncontrollable
- **E**: requirement links
- **C<sub>o</sub>**: observable contingent links
- **C<sub>u</sub>**: unobservable contingent links



W.C. ✓  
D.C. ✗  
S.C. ✗

# Partially Observable STPU 2/2

A Partially Observable STPU is **Dynamically Controllable** if there exists a strategy that depends on the outcomes of only those uncontrollable, observable events that have occurred in the past.



# Algorithms for Dynamic Controllability

## - Original Reduction Rules

- The **labeled distance graph** characterized for STPU.
- Tightening of edges is achieved by a set of **reduction rules**.
- A strongly polynomial-time algorithm for dynamic controllability is obtained by repeatedly applying these rules until a certain cutoff is reached.

(UPPER-CASE REDUCTION)

$$A \xleftarrow{B:x} C \xleftarrow{y} D \text{ adds } A \xleftarrow{B:(x+y)} D$$

(LOWER-CASE REDUCTION) If  $x < 0$ ,

$$A \xleftarrow{x} C \xleftarrow{c:y} D \text{ adds } A \xleftarrow{x+y} D$$

(CROSS-CASE REDUCTION) If  $x < 0$ ,  $B \neq C$ ,

$$A \xleftarrow{B:x} C \xleftarrow{c:y} D \text{ adds } A \xleftarrow{B:(x+y)} D$$

(NO-CASE REDUCTION)

$$A \xleftarrow{x} C \xleftarrow{y} D \text{ adds } A \xleftarrow{x+y} D$$

# Algorithms for Dynamic Controllability

## - Augmented Reduction Rules 1/3

---

**Must-Precede**( $A \stackrel{w}{\leftarrow} C$ ) // for STPU

---

1. If ( $x < 0$ ) return true;
2. return false;

---

Figure 5: Returns *true* if *C* must execute after *A* (*false* otherwise).

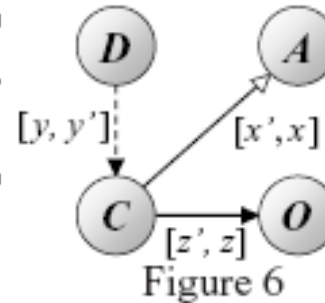
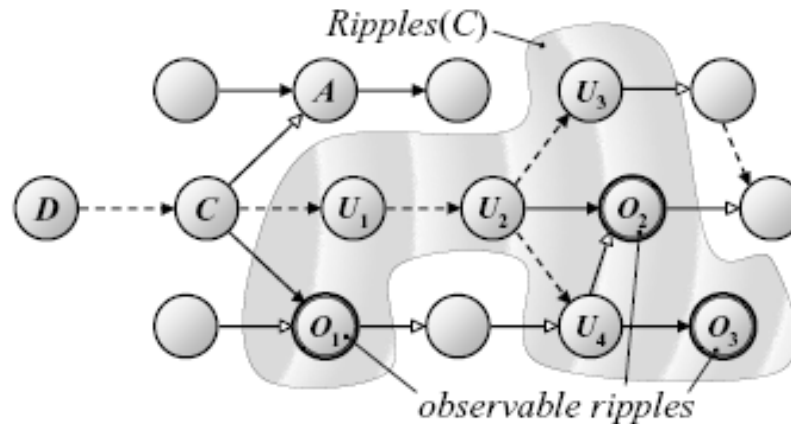


Figure 6

- O makes C **sufficiently Observable** to A by two conditions:
  - 1) O must be sufficiently punctual ( $z \leq x$ ): it must be always possible for A to occur during or before O.
  - 2) O must be sufficiently informative ( $z - z' \leq x - x'$ ): the width of the interval on C  $\rightarrow$  O must be no greater than the width of interval on C  $\rightarrow$  A.
- **Theorem:** If C is sufficiently observable to A via O, the subnetwork is locally controllable. (i.e., we can dynamically determine a value for A following O that satisfies the requirement link C  $\rightarrow$  A)

# Algorithms for Dynamic Controllability

## - Augmented Reduction Rules 2/3



- **Definition** : Given an unobservable, uncontrollable event  $C$ , we define  $Ripples(C)$  as the set of uncontrollables that lie at the conclusion of a contingent link that begins with either  $C$  or another unobservable uncontrollable in  $Ripples(C)$ .

# Algorithms for Dynamic Controllability

## - Augmented Reduction Rules 3/3

---

**Must-Precede-Observation**( $A \stackrel{x}{\leftarrow} C$ ) // for *POSTPU*

---

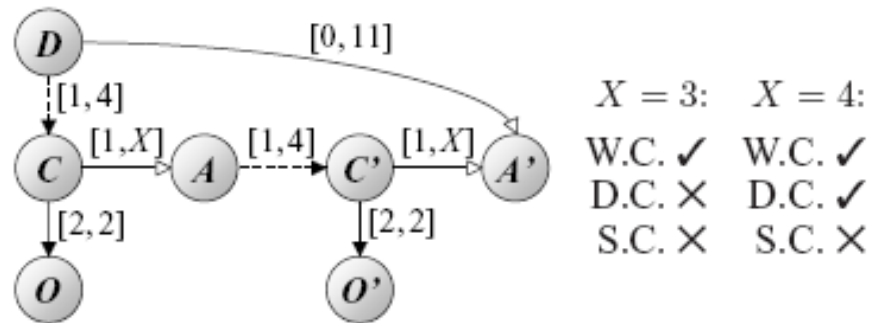
1. If ( $x < 0$ ) return true;
  2. If ( $C \in X_U$  and  $A \notin \text{Ripples}(C)$ )
  3. For each observable uncontrollable  $O \in \text{Ripples}(C)$
  4.     If ( $x < z$ ) next  $O$ ;
  5.     If ( $x - x' < z - z'$ ) next  $O$ ;
  6.     return false;
  7. return true;
  8. return false;
- 

- Replace the function Must-Precede()
- Line 2: If C is an unobservable uncontrollable and event A will not be subsequently scheduled by nature,
- Line 3-5: examine each observation point O in Ripples(C) to check if it is sufficiently punctual and sufficiently informative.
- Line 6,7: If both conditions are met, then sufficient observability is ensured.



# Algorithms for Dynamic Controllability

## - Incompleteness and an Open Problem



- A network where sufficient observability does not necessarily guarantee global dynamic controllability.
- When  $X=3$ : if both  $C$  and  $C'$  occurs as late as possible, waiting for observables require  $A'$  to execute no earlier than  $4+2+4+2=12$  units after  $D$ , violating upper bound of 11.

# Conclusion

- A new formalism—Partially Observable STPU, extends the STPU to include unobservable events.
- A re-characterization of its levels of controllability
- A sound extension to the reduction rules for maintaining the labeled distance graph.

# Future Work

- Resolve the complexity class of dynamic controllability
- Extending the linear cutoff algorithm to be applied to POSTPU.