

Agile Controllability of Simple Temporal Networks with Uncertainty and Oracles

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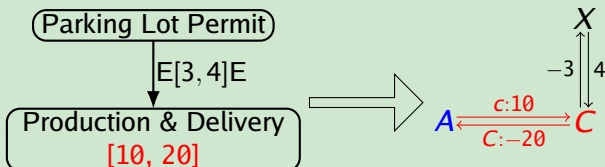
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Introduction

- **Simple temporal networks with uncertainty (STNUs)**
[Morris and Muscettola, 2005, Cairo and Rizzi, 2019] have gained wide recognition for modeling temporal constraints. They extend Simple Temporal Networks (STNs) [Dechter et al., 1991].
- **Dynamic controllability** [Morris and Muscettola, 2005] is currently the most studied notion for the temporal correctness of STNUs.
- For **checking dynamic controllability**, effective and efficient methods with polynomial complexity have been proposed [Morris, 2014, Cairo and Rizzi, 2019, Hunsberger and Posenato, 2022].

A motivating example

An STNU not dynamically controllable!



A, C represents the starting/ending event of "P. & D." task.
 X represents the ending event of "Parking Lot Permit" task.
Contingent link: $C - A \in [10, 20]$

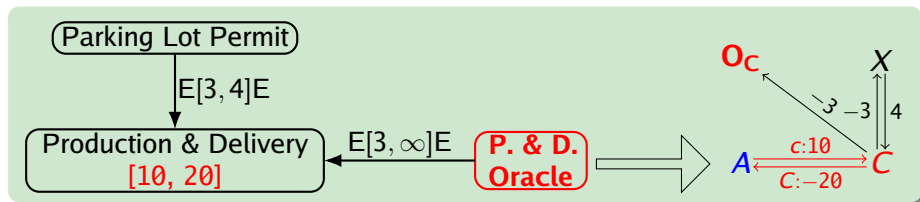
- A scheduler *executes* the network *assigning values* to timepoints.
- A scheduler only *decides* execution of A and X .
- A scheduler only assigns a value to C when it *occurs* and, thus, *the duration $d = C - A$ is revealed*.

Focus of the Talk

- Dynamic controllability assumes that the **duration of contingent activities**, hence the values of contingent timepoints, are only **known when they happen**.
- How the notion of **dynamic controllability** can be generalized such that a timepoint may **depend** not only **on timepoints** which are **earlier**, but also which are **known earlier**?

The Motivating Example revisited

Extending STNUs with **oracles**



- We propose to add the **oracle** O_C as a new special timepoint.
- If a contingent timepoint is associated with an oracle, then **the oracle** must be executed **before the contingent timepoint**, and at its execution, it **reveals** the **duration of the contingent link** in the current execution.

Focus of the Talk

- The main novelties:
 - ① The formal definition of STNUO (Simple Temporal Network with Uncertainty and Oracles).
 - ② A formal definition of Agile Controllability.
 - ③ ORUL, a set of rules for propagating constraints in STNUOs.
 - ④ An algorithm for checking Agile Controllability of STNUOs.
 - ⑤ A proof-of-concept implementation of the checking algorithm.

STNU Definition

Definition (STNU)

An STNU is a triple $(\mathcal{T}, \mathcal{C}, \mathcal{L})$, where:

- \mathcal{T} is a finite, non-empty set of real-valued variables called **timepoints**. \mathcal{T} is partitioned into \mathcal{T}_X , the set of **executable** timepoints, and \mathcal{T}_C , the set of **contingent** timepoints.
- \mathcal{C} is a set of **binary (ordinary) constraints**, each of the form $Y - X \leq \delta$ for some $X, Y \in \mathcal{T}$ and $\delta \in \mathbf{R}$.
- \mathcal{L} is a set of **contingent links**, each of the form (A, x, y, C) , where $A \in \mathcal{T}_X$, $C \in \mathcal{T}_C$ and $0 < x < y < \infty$. A is called the **activation** timepoint; C **contingent** timepoint.

Dynamic Controllability: preliminary definitions

Definition (Situation)

Each **situation** $\omega = (\omega_1, \dots, \omega_K) \in \Omega$ represents one possible complete set of values for the duration of the contingent links of \mathcal{N} (chosen by **nature**).

Definition (Schedule)

A **schedule** for an STNU $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L})$ is a mapping $\xi: \mathcal{T} \cup \{\perp\} \rightarrow \mathbf{R}$, where we assume that $\xi(\perp) = +\infty$. Ξ denotes the set of all schedules for an STNU. For historical reasons, we represent $\xi(X)$ as $[X]_\xi$.

Definition (Execution Strategy)

An **execution strategy** S for an STNU $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L})$ is a mapping $S: \Omega \rightarrow \Xi$.

Definition (Viable Execution Strategy)

An **execution strategy** S for an STNU $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L})$ is **viable** if for each situation $\omega \in \Omega$ the schedule $S(\omega)$ is a solution for \mathcal{N} , i.e., an assignment that **satisfies all the constraints** in the network.

Dynamic Controllability

Definition (Dynamic Execution Strategy)

An **execution strategy for an STNU** $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L})$ is **dynamic** if, for any two **situations** ω', ω'' and any **executable timepoint** $X \in \mathcal{T}_X$, it holds that:

if $[X]_{S(\omega')} = k$ and $S(\omega')^{\leq k} = S(\omega'')^{\leq k}$, then $[X]_{S(\omega'')} = k$,

where $S(\omega')^{\leq k}$ is the set of contingent link durations observed up to and including time k , called **history until k** . Since history also considers **contingent durations observed at instant k** , we say that the dynamic execution strategy implements the *instantaneous reaction* semantics.

Definition (Dynamic Controllability)

An STNU is **dynamically controllable** if there exists a **viable dynamic execution strategy** for it, that is, an execution strategy that assigns the executable timepoints with the guarantee that **all constraints will be satisfied, irrespectively of the duration values (within the specified bounds) of contingent links** [Hunsberger, 2016].

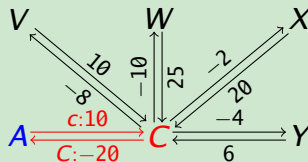
STNU graphical representation

Each STNU $\mathcal{S} = (\mathcal{T}, \mathcal{C}, \mathcal{L})$ has a corresponding graph $\mathcal{G} = (\mathcal{T}, \mathcal{E}_o \cup \mathcal{E}_{lc} \cup \mathcal{E}_{uc})$, also called **distance graph**, where the timepoints in \mathcal{T} serve as the graph's nodes and the constraints in \mathcal{C} and \mathcal{L} correspond to labeled, directed edges. In particular:

- $\mathcal{E}_o = \{X \xrightarrow{\delta} Y \mid (Y - X \leq \delta) \in \mathcal{C}\}$
- $\mathcal{E}_{lc} = \{A \xrightarrow{C:x} C \mid (A, x, y, C) \in \mathcal{L}\}$, and
- $\mathcal{E}_{uc} = \{C \xrightarrow{C:-y} A \mid (A, x, y, C) \in \mathcal{L}\}$.

STNU graphical representation

Example



Checking Dynamic Controllability

Rule	Pre-existing and generated edges	Applicability Conditions
(R)	$W \xrightarrow{v} Y \xrightarrow{u} X$ $\text{generated edge: } W \xrightarrow{u+v} X$	none
(U)	$X \xrightarrow{v} C \xrightarrow{C:-y} A$ $\text{generated edge: } X \xrightarrow{\max\{v-y, -x\}} A$	$(A, x, y, C) \in \mathcal{L}$
(L)	$X \xleftarrow{v} C \xleftarrow{C:x} A$ $\text{generated edge: } X \xleftarrow{x+v} A$	$v \leq 0$ or $X \in \mathcal{T}_C$, $X \neq C$, $\exists (B, s, t, X) \in \mathcal{L}$, $v \leq t$

Table: Edge-generation rules used by RUL [Cairo and Rizzi, 2019, Fig. 2]

- Constraint propagation algorithms have been proposed to check whether an STNU is dynamically controllable [Morris, 2014, Cairo et al., 2018, Hunsberger and Posenato, 2022, Hunsberger and Posenato, 2023].
- The algorithm terminates when either reaching network quiescence (the network is dynamically controllable), or a *negative cycle* is found (the network is not dynamically controllable).

Extending STNUs with Oracles

Definition (STNU with Oracles (STNUO))

An STNUO is a tuple $(\mathcal{T}, \mathcal{C}, \mathcal{L}, \mathcal{O})$, where:

- \mathcal{T} is a finite, non-empty set of real-valued variables called **timepoints**. \mathcal{T} is partitioned into \mathcal{T}_X , the set of **executable** timepoints and \mathcal{T}_C , the set of **contingent timepoints**. $\mathcal{T}_O \subseteq \mathcal{T}_X$, is the set of **oracle** timepoints.
- \mathcal{C} is a set of binary (ordinary) constraints, each of the form $Y - X \leq \delta$ for some $X, Y \in \mathcal{T}$ and $\delta \in \mathbb{R}$.
- \mathcal{L} is a set of contingent links, each of the form (A, x, y, C) , where $A \in \mathcal{T}_X$, $C \in \mathcal{T}_C$ and $0 < x < y < \infty$. A is called the *activation* timepoint; C *contingent* timepoint. If (A_1, x_1, y_1, C_1) and (A_2, x_2, y_2, C_2) are distinct contingent links, then $C_1 \neq C_2$.
- $\mathcal{O}: \mathcal{T}_C \rightarrow \mathcal{T}_O \cup \{\perp\}$ is a function that associates a contingent timepoint with its corresponding **oracle**, if any. For the sake of simplicity and without loss of generality, we assume that each **oracle** is associated with a single **contingent timepoint**.

Extending Execution Strategies

Definition (Agile Execution Strategy with Oracles)

Let $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L}, \mathcal{O})$ be an STNUO. An *execution strategy with oracles* S_O for \mathcal{N} is *agile* if, for any two situations ω', ω'' and any executable timepoint $X \in \mathcal{T}$, it holds that:

if $[X]_{S_O(\omega')} = k$ and $S_O(\omega')^{\leq k} = S_O(\omega'')^{\leq k}$, then $[X]_{S_O(\omega'')} = k$

where $S_O(\omega)$ is a schedule determined by the execution strategy with oracles S_O given the situation ω , and $S_O(\omega)^{\leq k}$ is the **oracle history** until k .

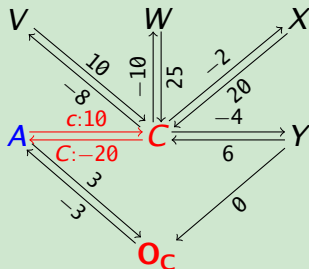
Definition (Agile Controllability (AC))

An STNUO $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L}, \mathcal{O})$ is *agilely controllable* if it admits a viable agile execution strategy with oracles.

Controllability of STNUs with Oracles

Example

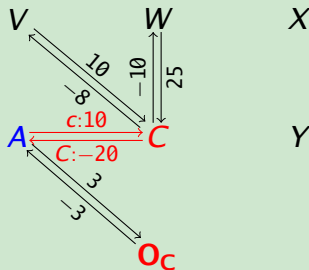
Let us consider an STNUO $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L}, \mathcal{O})$ where \mathbf{O}_C is the oracle for C that must be executed 3 time units after the activation timepoint A . Let $d \in [10, 20]$ be the duration revealed by the oracle \mathbf{O}_C .



Scheduling STNUs with Oracles – I

Example

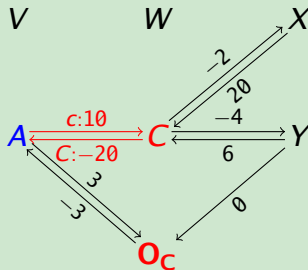
- 1 **V can neither be scheduled with nor without an oracle** because if the contingent link lasts 10, the oracle is executed too late to allow V to be executed, satisfying the constraint with C.
- 2 **W must be scheduled before the oracle** to satisfy the constraint with C. Therefore, the oracle is not relevant for scheduling W.



Scheduling STNUs with Oracles – II

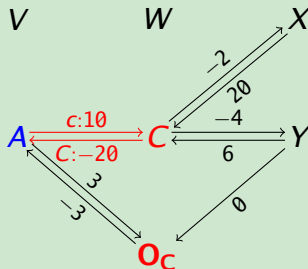
Example (O_C reveals duration d)

- ③ X can be scheduled without oracle (for example, $X = A + 2$) or with oracle (for example, $X = O_C - 3 + d - 4 = A + d - 4$, where 4 is one of the possible values to choose.)
- ④ Y can be scheduled only with oracle: $Y = O_C - 3 + d - 5 = A + d - 5$. Thus, Y can be executed only after O_C .



Scheduling STNUs with Oracles – III

Example



- Node X can be scheduled since the **contingency** of C is 10 smaller than 18, the range of possible distances between C and X.
- For node Y, these values are 10 and 2. Applying the rules **U** and **L** to Y, C, and A leads to a negative cycle.

Rule propagation and oracles

For the **propagation of constraints**, this has the following consequences:

- 1 If the oracle is not used, then the **L** and **U** rules must be applied.
- 2 If the oracle is used, then the **L** and **U** rules must not be applied on X and C , but the additional constraint $O_C \leq X$ must be added to the STNUO.

Example

- Using the oracle avoids the negative cycle resulting from propagation in case (1), such as Y .
- Using the oracle as in case (2) might lead to a conflict that was not there, such as W .
- For timepoint X , there is the choice to either apply the rules **L** and **U** or consider the oracle O_C and introduce constraint $O_C \leq X$.

Using Oracles or not?

Definition (Oracle Candidate)

We call $\mathcal{U} = \{(X, C) \mid X \in \mathcal{T}_X, C \in \mathcal{T}_C, \mathcal{O}(C) \neq \perp\}$ the set of all **potential oracle candidates**. If there is constraint $X \leq C + \delta$, or a constraint $C \leq X + \delta'$ with $C \in \mathcal{T}_C$, $\mathcal{O}(C) \neq \perp$, $X \in \mathcal{T}_X$, $\delta < 0$, and $0 \leq \delta'$, then we call (X, C) an **oracle candidate** since a viable execution strategy *could* require the usage of the oracle.

Example

All pairs $(V, C), (W, C), (X, C), (Y, C)$ are **oracle candidates**.

Example

(Y, C) is named **oracle dependent** as there is no viable execution strategy without using the oracle O_C .

ORUL: Propagation rules for STNUOs

Rule	Pre-existing and generated edges	Conditions
Relax (REL)		none
Upper (UPP)		$(X, C) \in \mathcal{U}^-$ or $\mathcal{O}(C) = \perp$ or $X \in \mathcal{T}_C$
Lower (LOW)		$X \in \mathcal{T}_X$, $((X, C) \in \mathcal{U}^-$ or $\mathcal{O}(C) = \perp$), $v \leq 0$, or $X \in \mathcal{T}_C$, $X \neq C$, $\exists (B, w, y, X) \in \mathcal{L}$, $v \leq y$
Oracle (ORC)		$X \in \mathcal{T}_X$, $(X, C) \in \mathcal{U}^+$

- \mathcal{U}^+ is the set of all oracle candidates for which the oracle has to be used, and
- \mathcal{U}^- is the set of all oracle candidates for which the oracle has not to be used.

Agile Controllability

Theorem

Let

- $\mathcal{N} = (\mathcal{T}, \mathcal{C}, \mathcal{L}, \mathcal{O})$ be an STNUO;
- $\mathcal{U} = \{(X, C) \mid X \in \mathcal{T}_X, C \in \mathcal{T}_C, \mathcal{O}(C) \neq \perp\}$ be the set of all possible pairs (ordinary node, contingent node) where the contingent node has its corresponding oracle.

\mathcal{N} is **Agilely Controllable** if $\exists \mathcal{U}^+, \mathcal{U}^-$ such that $\mathcal{U} = \mathcal{U}^+ \cup \mathcal{U}^-$, $\mathcal{U}^+ \cap \mathcal{U}^- = \emptyset$, and the closure of \mathcal{N} considering $\mathcal{U}^+, \mathcal{U}^-$ for the propagation rules of ORUL does not include a negative cycle.

The Checking Algorithm CheckAC

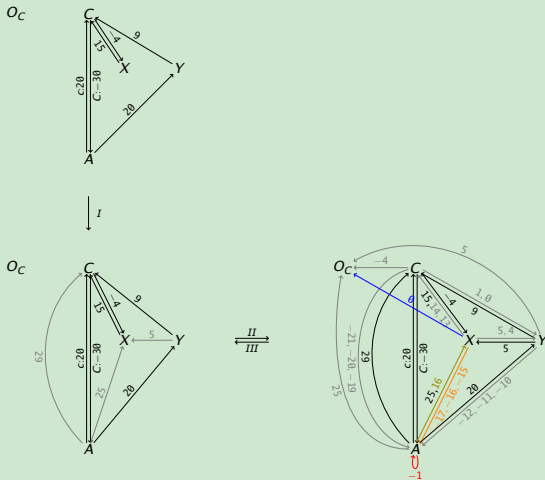
Input: \mathcal{N} an STNUO, \mathcal{U}^- , \mathcal{U}^+

Output: Agile controllability status

```
1 ok  $\leftarrow$  applyRules( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
2 if ok then
3   save( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
4    $\mathcal{U}^0 \leftarrow$  getOpenOracles( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
5   if  $\mathcal{U}^0 \neq \emptyset$  then
6     ( $X$ ,  $C$ )  $\leftarrow$  select( $\mathcal{U}^0$ );
7     if interval( $X$ ,  $C$ ) > contingencyInterval( $C$ ) then
8        $\mathcal{U}^- \leftarrow \mathcal{U}^- \cup \{(X, C)\}$ ;
9       ok  $\leftarrow$  checkAC( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
10      if not ok then
11        restore( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
12      if ( $X$ ,  $C$ )  $\notin \mathcal{U}^-$  then
13         $\mathcal{U}^+ \leftarrow \mathcal{U}^+ \cup \{(X, C)\}$ ;
14        ok  $\leftarrow$  checkAC( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
15        if not ok then
16          restore( $\mathcal{N}$ ,  $\mathcal{U}^-$ ,  $\mathcal{U}^+$ );
17 return ok
```

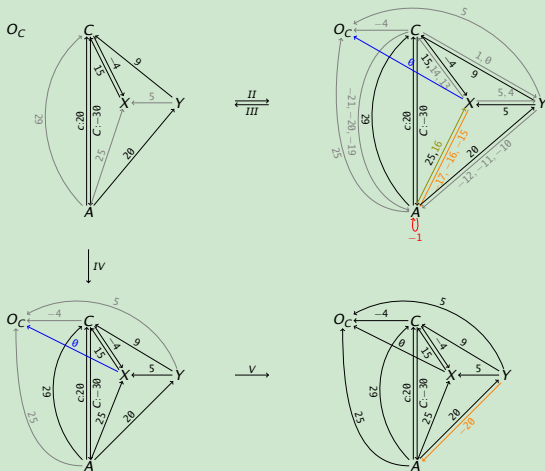
Applying CheckAC on an STNUO I

Example



Applying CheckAC on an STNUO II

Example



Proof-of-concept prototype¹

- The algorithm has been implemented in Java.
- Experiments on an Ubuntu 22 machine having 16GB of RAM and an AMD EPYC-Rome (8) @ 2.6GHz CPU.
- Input data from the OSTNU benchmark, which is available online at <https://profs.scienze.univr.it/~posenato/software/benchmarks/OSTNUBenchmarks2024.tgz> [Posenato, 2022].
- 30 random STNUO instances with 30 nodes (5 contingent and 2 oracles).
- All execution average times are below 3 s.
- Comparable to the algorithm presented by Posenato *et al.* [Posenato et al., 2024].

¹The source code of the prototype implementation, the parser of the data sets used for the experiments, and the complete results are publicly available at <https://git-isys.aau.at/ics/Papers/stnuo.git>

Concluding remarks

- We proposed **agile controllability (AC)** as a proper generalization of the well-established notion of dynamic controllability for STNUs,
- **STUNOs, Simple Temporal Networks with Uncertainty and Oracles**, can express *when* information about the timepoint of future contingent links is available,
- AC is expected to support a **wide range of applications** as it provides a less restrictive notion of temporal correctness of plans, processes, requirements, contracts, etc.
- Indeed, the **algorithm CheckAC** and its related **proof-of-concept implementation**, as it is presented here, is intended to demonstrate the existence of an effective backtracking algorithm to check the agile controllability of an STNUO. Optimizations are part of the ongoing research.

References I

- [Cairo et al., 2018] Cairo, M., Hunsberger, L., and Rizzi, R. (2018).
Faster dynamic controllability checking for simple temporal networks with uncertainty.
In 25th International Symposium on Temporal Representation and Reasoning (TIME 2018),
volume 120 of *LIPIcs*, pages 8:1–8:16.
ISBN: 9783959770897.
- [Cairo and Rizzi, 2019] Cairo, M. and Rizzi, R. (2019).
Dynamic controllability of simple temporal networks with uncertainty: Simple rules and fast
real-time execution.
Theoretical Computer Science, 797:2–16.
- [Dechter et al., 1991] Dechter, R., Meiri, I., and Pearl, J. (1991).
Temporal constraint networks.
Artificial intelligence, 49(1–3):61–95.
- [Hunsberger, 2016] Hunsberger, L. (2016).
Efficient execution of dynamically controllable simple temporal networks with uncertainty.
Acta Informatica, 53:89–147.

References II

- [Hunsberger and Posenato, 2022] Hunsberger, L. and Posenato, R. (2022).
Speeding up the RUL[−] Dynamic–Controllability–Checking Algorithm for Simple Temporal Networks with Uncertainty.
In Proceedings of the 36th AAAI Conference on Artificial Intelligence, volume 36, pages 9776–9785. AAAI Press.
- [Hunsberger and Posenato, 2023] Hunsberger, L. and Posenato, R. (2023).
A Faster Algorithm for Converting Simple Temporal Networks with Uncertainty into Dispatchable Form.
Information and Computation, 293.
- [Morris, 2014] Morris, P. (2014).
Dynamic controllability and dispatchability relationships.
In CPAIOR 2014, volume 8451 of *LNCS*.
- [Morris and Muscettola, 2005] Morris, P. H. and Muscettola, N. (2005).
Temporal dynamic controllability revisited.
In 20th National Conf. on Artificial Intelligence (AAAI–2005).
- [Posenato, 2022] Posenato, R. (2022).
CSTNU Tool: A Java library for checking temporal networks.
SoftwareX, 17:100905.

References III

- [Posenato et al., 2024] Posenato, R., Franceschetti, M., Combi, C., and Eder, J. (2024). Introducing agile controllability in temporal business processes. In *Enterprise, Business–Process and Information Systems Modeling – 25th International Conference, BPMDS 2024, and 29th International Conference, EMMSAD 2024*, volume 511 of *Lecture Notes in Business Information Processing*, pages 87–99. Springer.