

# ***Introducing Interdependent Simple Temporal Networks under Uncertainty for Multi-agent Temporal Planning***

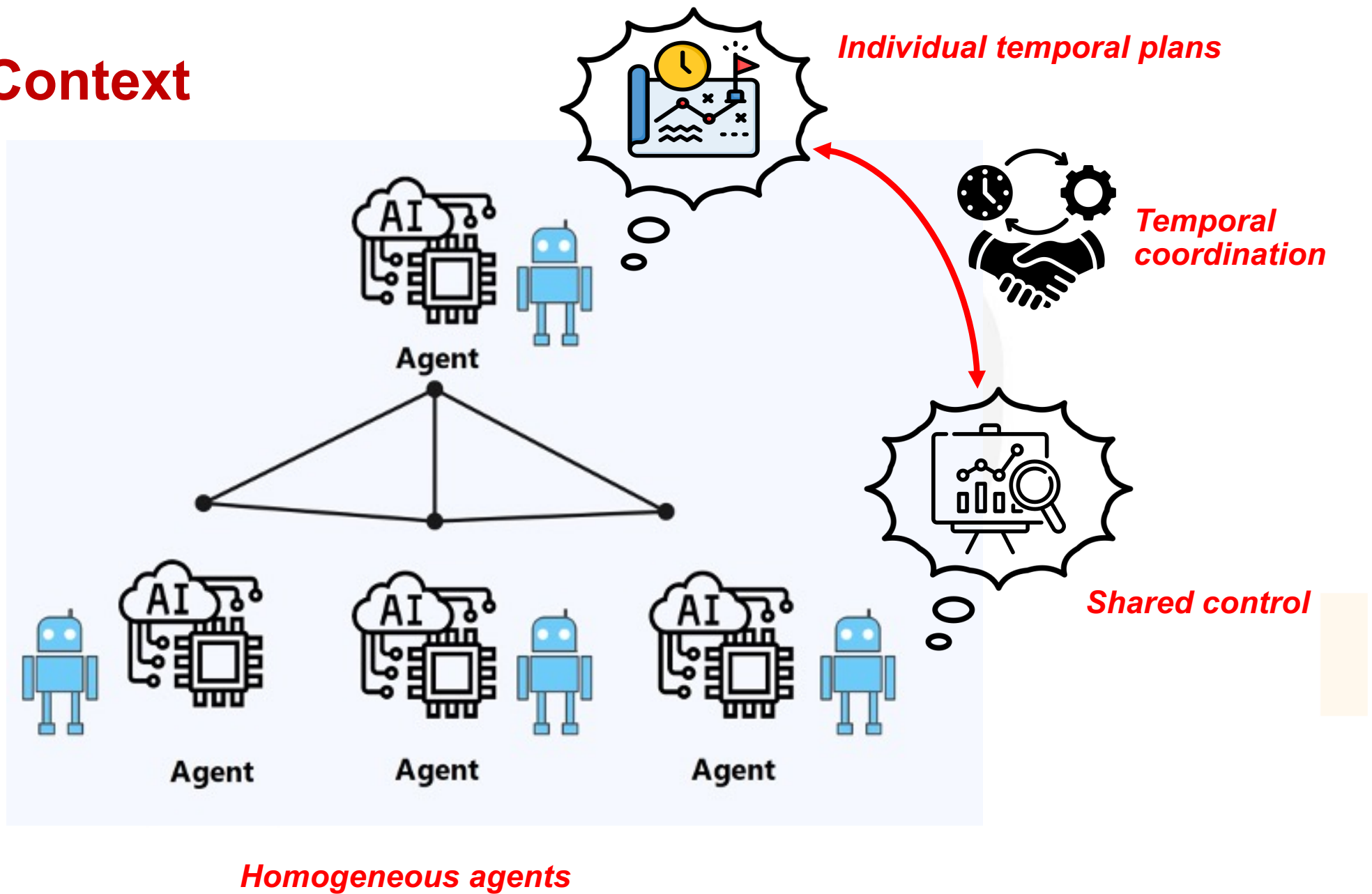
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PICS – LGP – UTTOP – Tarbes

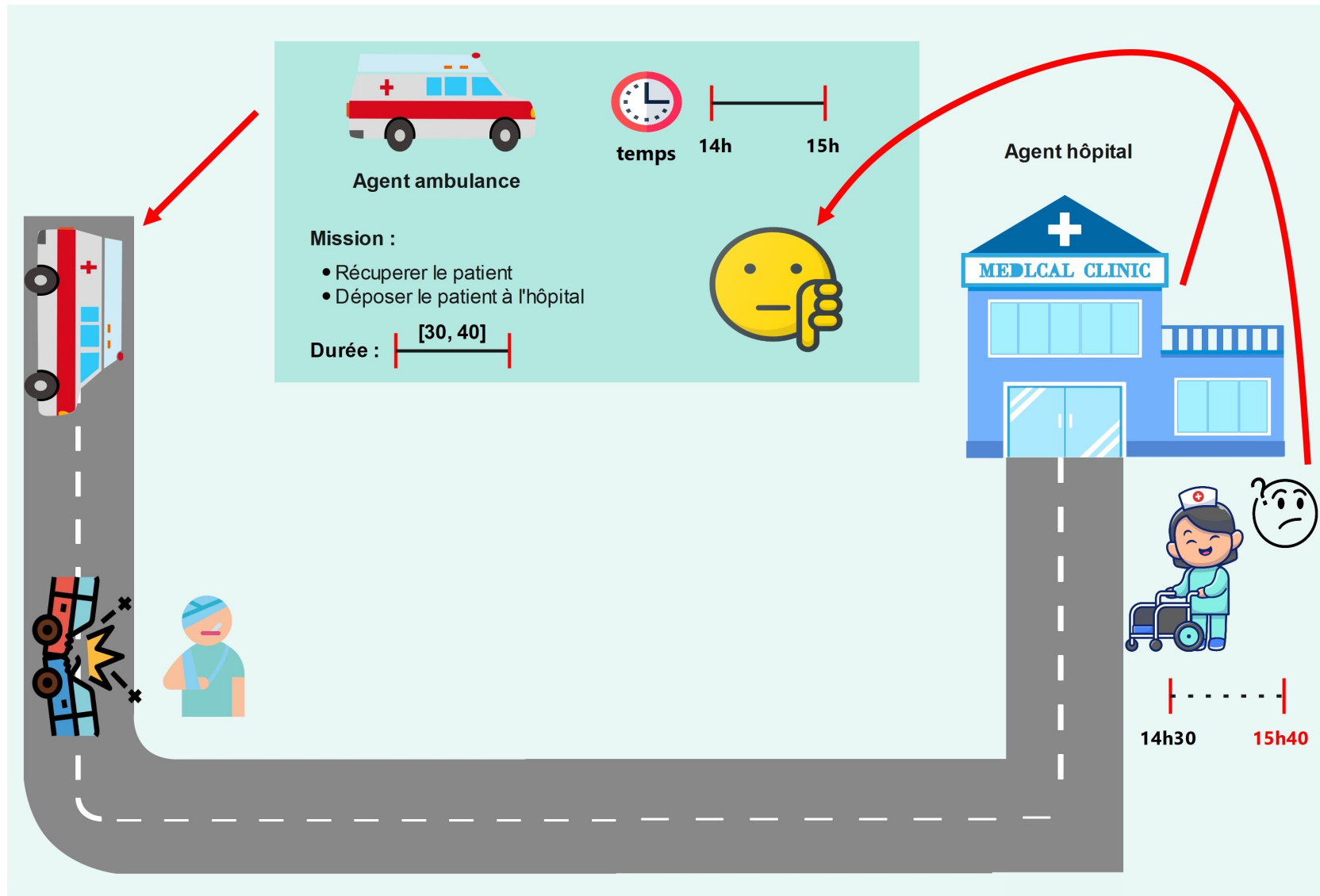
PSO – FBK – Trento – Italy

# Context and Motivation

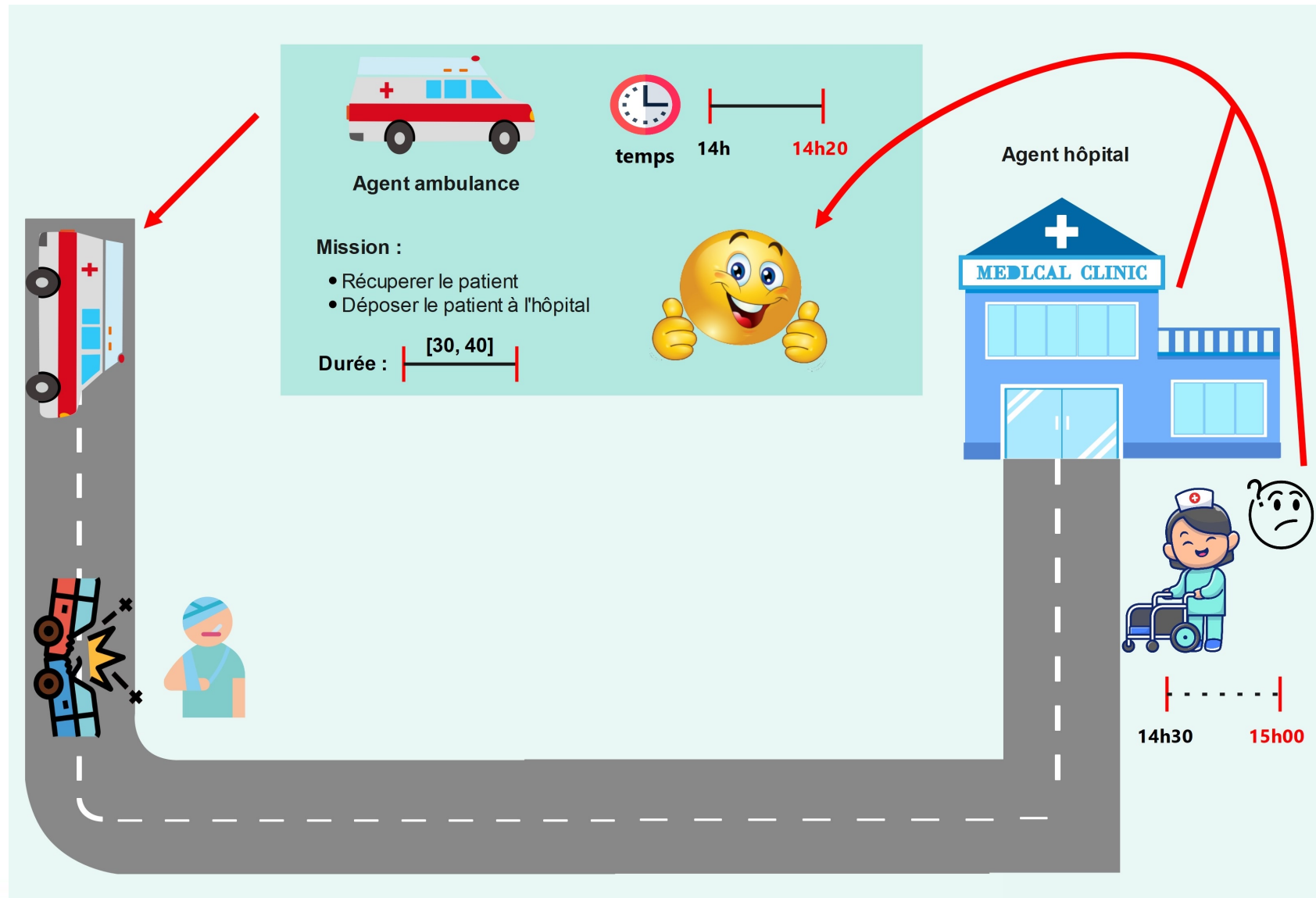
# Context

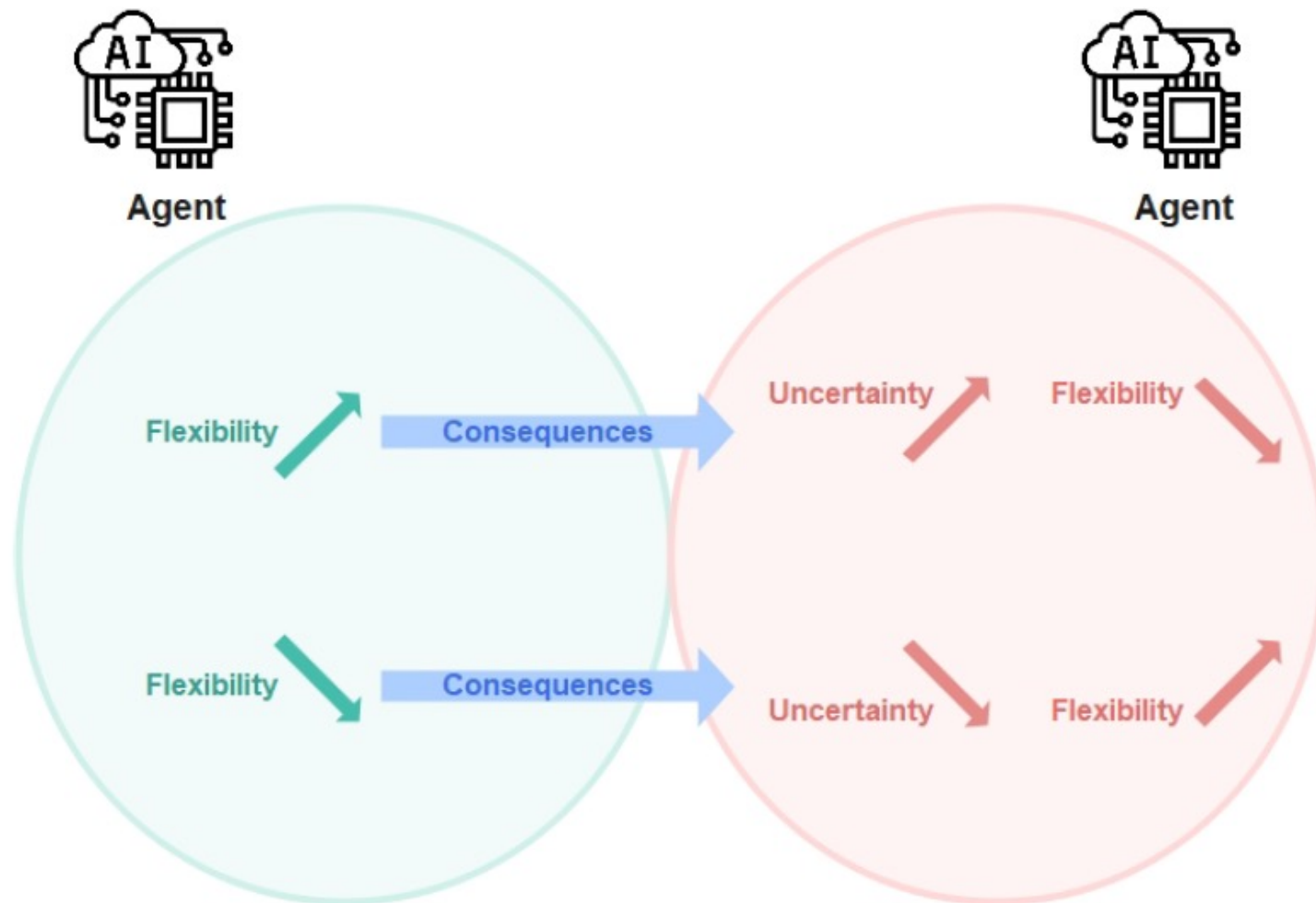


# Illustrative example



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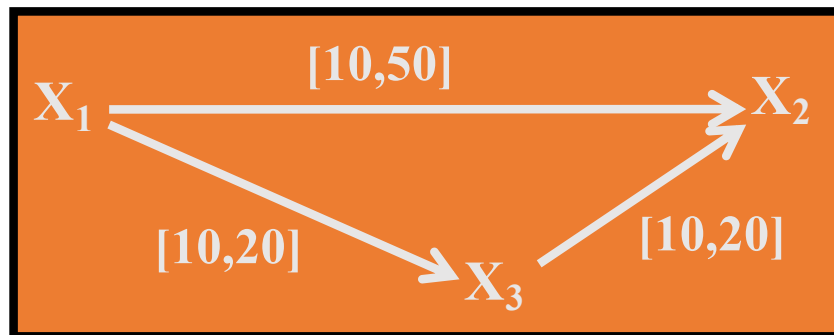


# Background

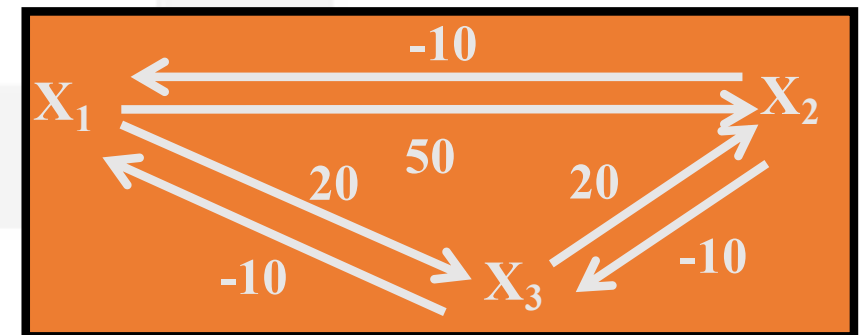
# STN

STN (Simple Temporal Network) is **consistent** if there exists an assignment of the time-points that satisfies all the constraints

STN = (V, E)



Distance graph



Polynomial propagation type algorithm in  $O(n^3)$  :

- Path consistency
- Floyd-Warshall

Negative cycle = inconsistency

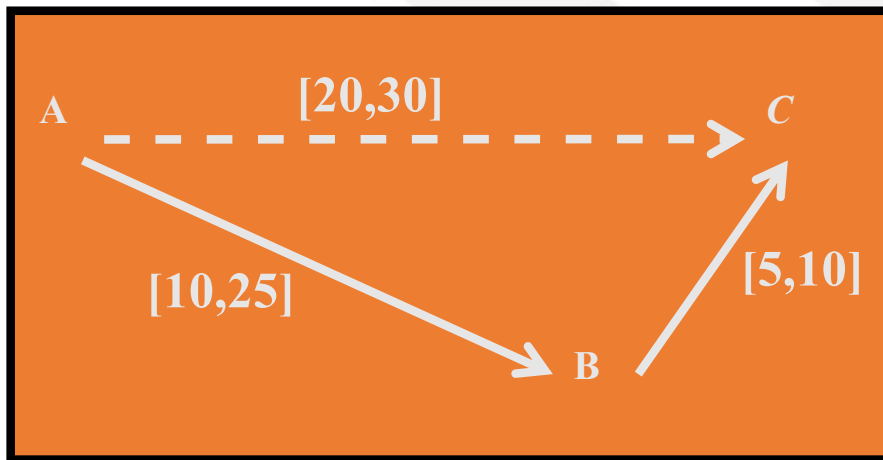


# STNU

STNU (Simple Temporal Network with Uncertainty)

[Vidal et Fargier, 1999]

➤ idem STN + = intervals of possible durations : **controllable** / **contingent**



STNU  $X = (V, E, C)$

Consistency

→→→

**Controllability :**

A situation  $\omega = \langle \omega_1 \in [L_1, U_1], \dots, \omega_C \in [L_{|C|}, U_{|C|}] \rangle \in \Omega$

A schedule  $\delta = \{\delta(v_1), \dots, \delta(v_{|V_c|})\}$  with  $\forall i, v_i \in V_c$

Clbty  $\equiv$  There exists a valid  $\delta$  for each  $\omega$  ?

# 3 levels of Controllability

**Definition 7. (Strong Controllability (SC))** An STNU  $\mathcal{X}$  is **strongly controllable** iff  $\exists \delta$  such that  $\forall \omega \in \Omega$   $\delta$  is a solution of  $\mathcal{X}_\omega$ .

Execution semantics:  $\forall v_i \in V_c$ ,  $dec(v_i) = v_0$ , and the observations are free: possibly no observation ( $\forall \omega_k \in \omega$ ,  $obs(\omega_k) = \emptyset$ ) or observations during execution that will just update the bounds of the constraints in the network.

**Definition 6. (Dynamic Controllability (DC))** An STNU  $\mathcal{X}$  is **dynamically controllable** iff it is weakly controllable and  $\forall v_i \in V_c$ ,  $\forall \omega, \omega' \in \Omega$ ,  $\omega \preceq^{v_i} \omega' \implies \delta(v_i) = \delta'(v_i)$

Execution semantics:  $\forall \omega_k \in \omega$ ,  $obs(\omega_k) = end(c_k)$ , and  $\forall v_i \in V_c$ ,  $dec(v_i) = v_i$

**Definition 5. (Weak Controllability (WC))** An STNU  $\mathcal{X}$  is **weakly controllable** iff  $\forall \omega \in \Omega$ ,  $\exists \delta$  such that  $\delta$  is a solution of  $\mathcal{X}_\omega$ .

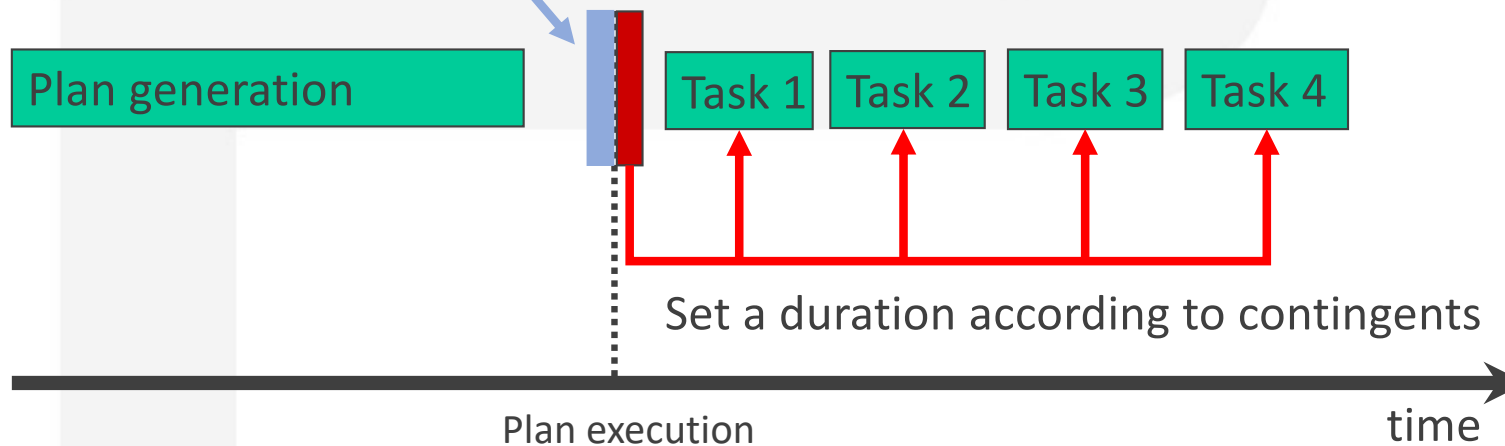
Execution semantics:  $\forall \omega_k \in \omega$ ,  $obs(\omega_k) = v_0$ , and the decision policy is free:  $\forall v_i \in V_c$ ,  $dec(v_i) \leq v_i$

**Strong Controllability  $\implies$  Dynamic Controllability  $\implies$  Weak Controllability**

# WC

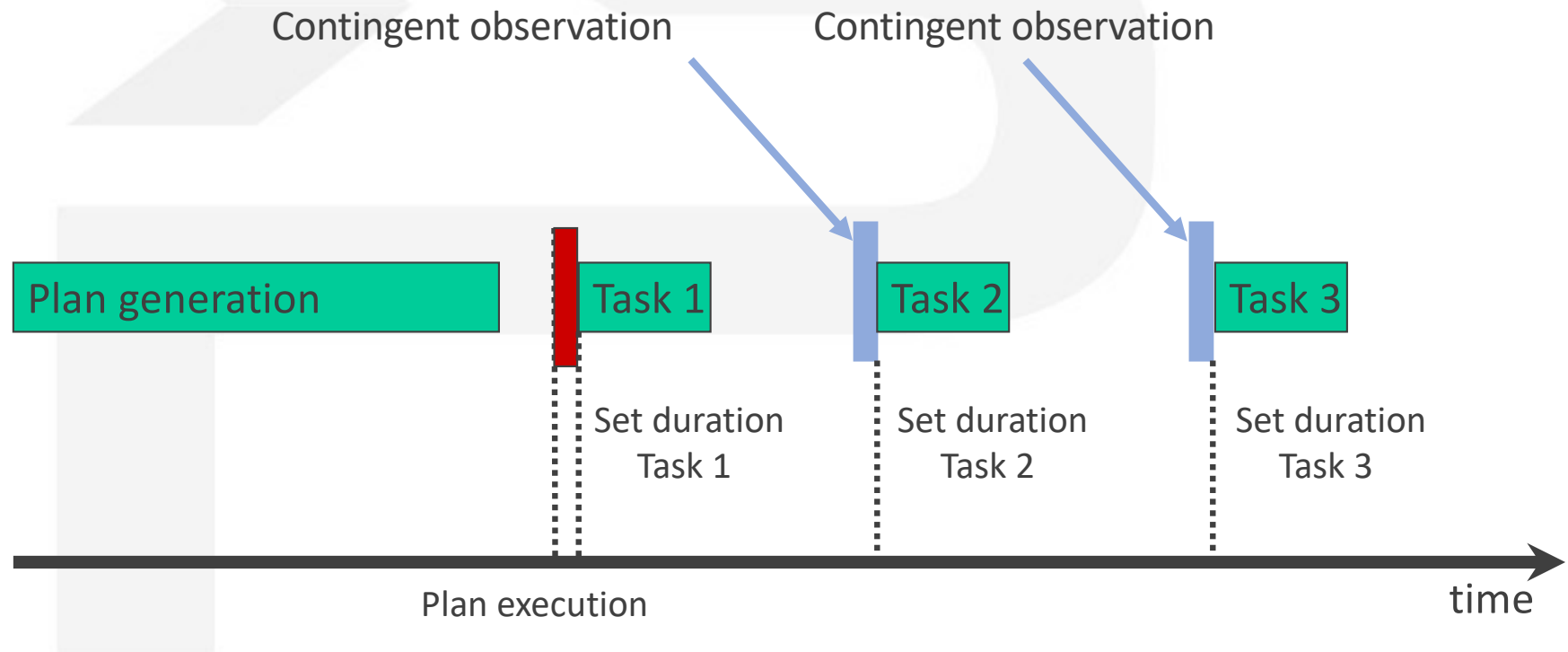
- **Weak Controllability (WC):** assumes contingent durations will be known just before execution = pick up the solution that matches it.

Receive contingents' duration



# DC

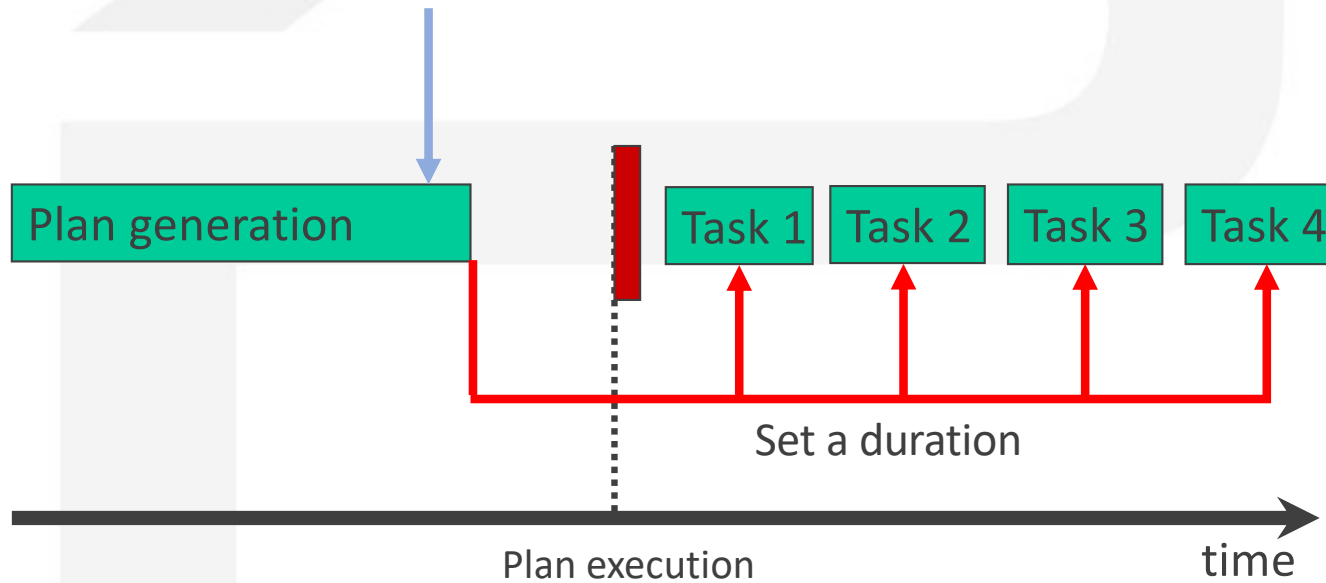
- **Dynamic Controllability (SC):** assumes sequential decisions adapt to past observations.



# SC

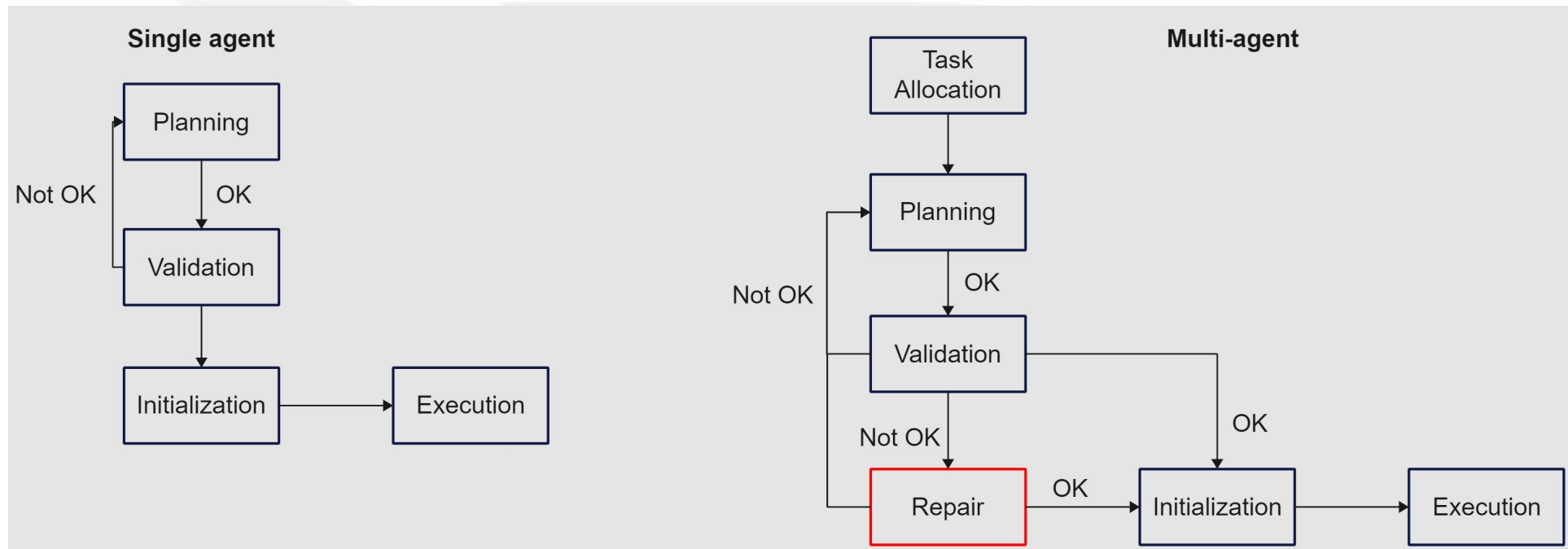
- **Strong Controllability:** assumes no observations, which requires a fixed schedule that satisfies the constraint, whatever the contingent durations will be.

No observation/information on contingents



# A new multi-agent architecture + repair needs

➤ Uncertainties come from other agents



➤ Repair an agent plan by adjusting uncertain durations (local repair)

# Global model for the multi-agent temporal coordination ?

# Question ?

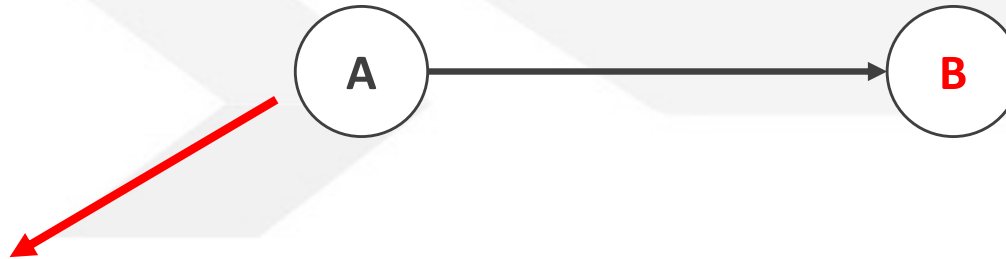
How to model the problem ?

Is there a model in the literature for that ?

→ No !



# Model: the notion of contracts

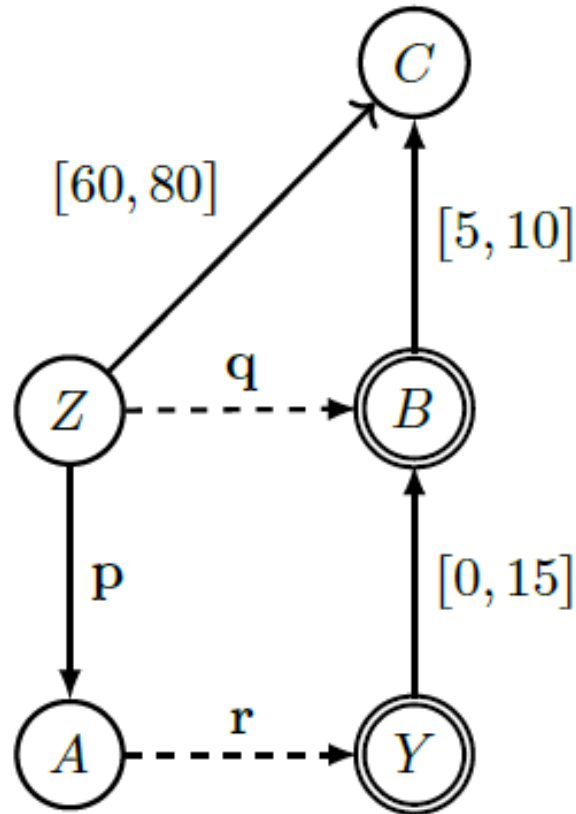


## A contract:

- A common constraint between at least 2 agents
- Only one **owner** agent that will decide **B**
- May have multiple **compliant** agents that observes **B**

# Model: contracting STNU

From STNU to cSTNU



Contracts:

- p (owned)
- q and r (observed)



Label	Contract
p	[20, 25]
q	[60, 75]
r	[25, 35]

outside the cSTNU

# Model: MISTNU

## Multi-agent Interdependent Simple Temporal Network under Uncertainty (MISTNU)

► **Definition 9.** (*MISTNU*) A MISTNU is a tuple  $\mathcal{G} = \langle A, \Sigma, B \rangle$  such that:

- $A$  is a set of agents  $\{a_1, a_2, \dots, a_n\}$ ;
- $\Sigma$  is a set of cSTNUs  $\mathcal{S}_a = \langle V_a, R_a, W_a, E_a, C_a, O_a \rangle$ , one for each  $a \in A$ , such that
  - $\forall a \in A, v_z \in V_a$ , where  $v_z$  is the mutual reference time point;
  - for every pair of agents  $a, b \in A, W_a \cap W_b = \emptyset$
- $B$  is a map from contracts to bounds  $B : \bigcup_{a \in A} (R_a \cup W_a) \rightarrow \mathbb{R}^2$ . For the sake of this paper, we write  $l$  and  $u$  for  $\langle l_p, u_p \rangle = B(p)$ .

# Model: MISTNU

Multi-agent Interdependent Simple Temporal Network under Uncertainty  
(MISTNU)

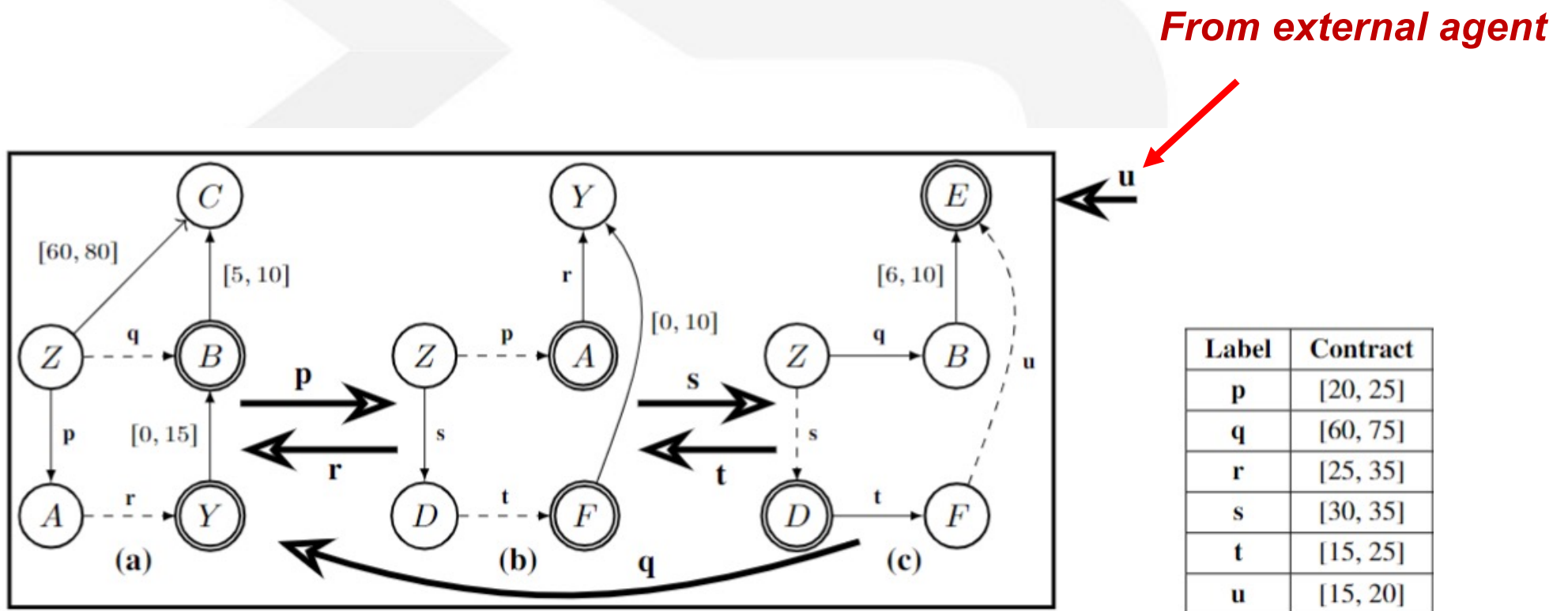
## Expressivity of MISTNU:

- Represent each agent and their networks with contracts
- Still represent real contingents (contract with no owner)
- Only 1 agent = STNU



**Extend existing multi-agent models**

# Model: MISTNU example



# Model: MISTNU properties

► **Definition 10. (cSTNU reduction)** Given a cSTNU  $\mathcal{S} = \langle V, R, W, E, C, O \rangle$  and a map  $B : W \cup R \rightarrow \mathbb{R}^2$  giving bounds to contracts,  $\mathcal{S}$  can be reduced to an STNU  $\mathcal{S}^g \doteq \langle V, E', C' \rangle$  with:

- $E' = E \cup \{v_i \xrightarrow{[l,u]} v_j \mid v_i \xrightarrow{p} v_j \in O, B(p) = \langle l, u \rangle\}$
- $C' = \{v_i \xrightarrow{[l,u]} v_j \mid v_i \xrightarrow{p} v_j \in C \cup O, B(p) = \langle l, u \rangle\}$

# Model: MISTNU properties

► **Definition 15.** (*Controllability*) Given a MISTNU  $\mathcal{G} = \langle A, \Sigma, B \rangle$ , we define the  $\tau$ -controllability  $L_\tau$  of  $\mathcal{G}$  with  $\tau = \{Weak, Dynamic, Strong\}$  as:

$$L_\tau \equiv \forall S_a \in \Sigma, S_a^\mathcal{G} \text{ is } \tau - \text{controllable.}$$

where  $S_a^\mathcal{G}$  is the STNU obtained from  $S_a$  by the cSTNU reduction of Definition 11.

# Model: MISTNU repair

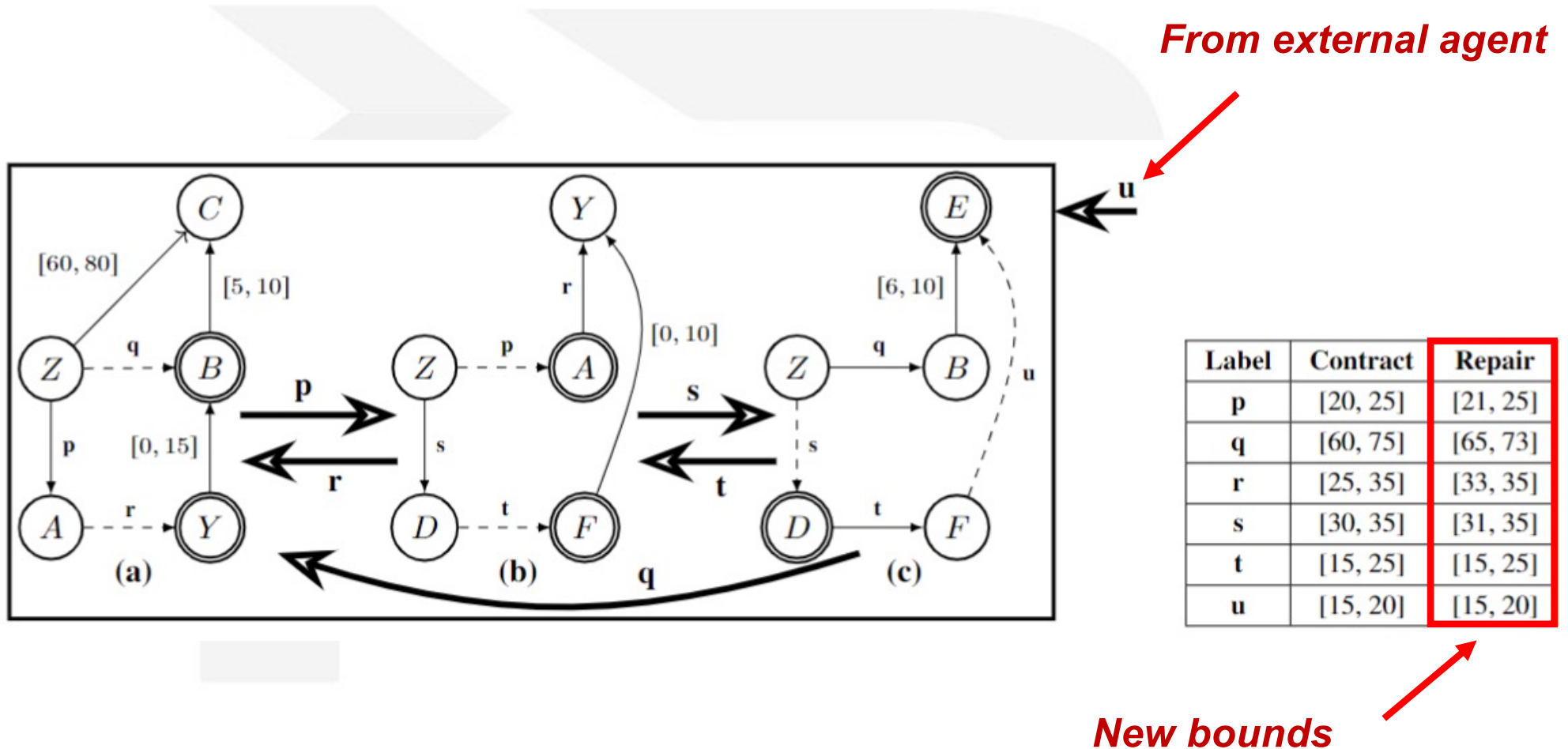
How to define the repair problem ?

► **Definition 16. (Repair)** Given a global model  $\mathcal{G} = (A, \Sigma, B)$  such that for some agent  $a \in A$ ,  $\mathcal{S}_a$  is not  $\tau$ -controllable with  $\tau = \{\text{Weak}, \text{Dynamic}, \text{Strong}\}$ . The  $L_\tau$ -**repair problem** consists in finding new bounds  $B'$  for a global model  $\mathcal{G}' = (A, \Sigma, B')$  such that:

- $\forall p \in P$  let  $\langle l, u \rangle = B(p)$  and  $\langle l', u' \rangle = B'(p)$  where  $l' \geq l$ ,  $u' \leq u$ ;
- $\mathcal{G}'$  is  $L_\tau$ -controllable.



# Model: MISTNU example



# Model: MISTNU repair

► **Definition 17. (Optimal Repair)** Let  $\mathcal{G} = (A, \Sigma, B)$ , be a non  $L_\tau$  MISTNU and let  $R_{\mathcal{G}}$  be the set of all the solutions to the  $L_\tau$ -repair problem for  $\mathcal{G}$ . An **optimal  $L_\tau$ -repair** for  $\mathcal{G}$  is defined as:

$$\operatorname{argmin}_{\mathcal{G}' \in R_{\mathcal{G}}} \left( \sum_{p \rightarrow \langle l', u' \rangle \in B'} ((l' - l) + (u - u')) \mid \langle l, u \rangle = B(p) \right)$$

# Model: MISTNU repair

► **Definition 18. (Fair-Optimal Repair)** Let  $\mathcal{G} = (A, \Sigma, B)$ , be a non  $L_\tau$ -controllable MISTNU and let  $R_{\mathcal{G}}^{opt}$  be the set of all the solutions to the optimal  $L_\tau$ -repair problem for  $\mathcal{G}$ . A **fair-optimal  $L_\tau$ -repair** for  $\mathcal{G}$  is defined as:

$$\operatorname{argmax}_{\mathcal{G}' \in R_{\mathcal{G}}^{opt}} \left( \left| \{ \langle p_1, p_2 \rangle \in C_{|P|}^2 \mid \frac{((l'_{p_1} - l_{p_1}) + (u_{p_1} - u'_{p_1}))}{u_{p_1} - l_{p_1}} = \frac{((l'_{p_2} - l_{p_2}) + (u_{p_2} - u'_{p_2}))}{u_{p_2} - l_{p_2}} \} \right| \right)$$

# Model: MISTNU complexity

## Complexity of the checking problem

### Strong and Dynamic controllability (SC/DC):

- Checking SC and DC for STNU is polynomial

➔ **Polynomial !**

### Weak controllability (WC):

- Checking WC is co-NP-complete for STNU

➔ **Co-NP-complete**

# Model: MISTNU complexity

## Complexity of the repair problem

### Strong and Dynamic controllability (SC/DC):

- Need to check all possible combinations of lower and upper bounds
- Checking one combination is polynomial

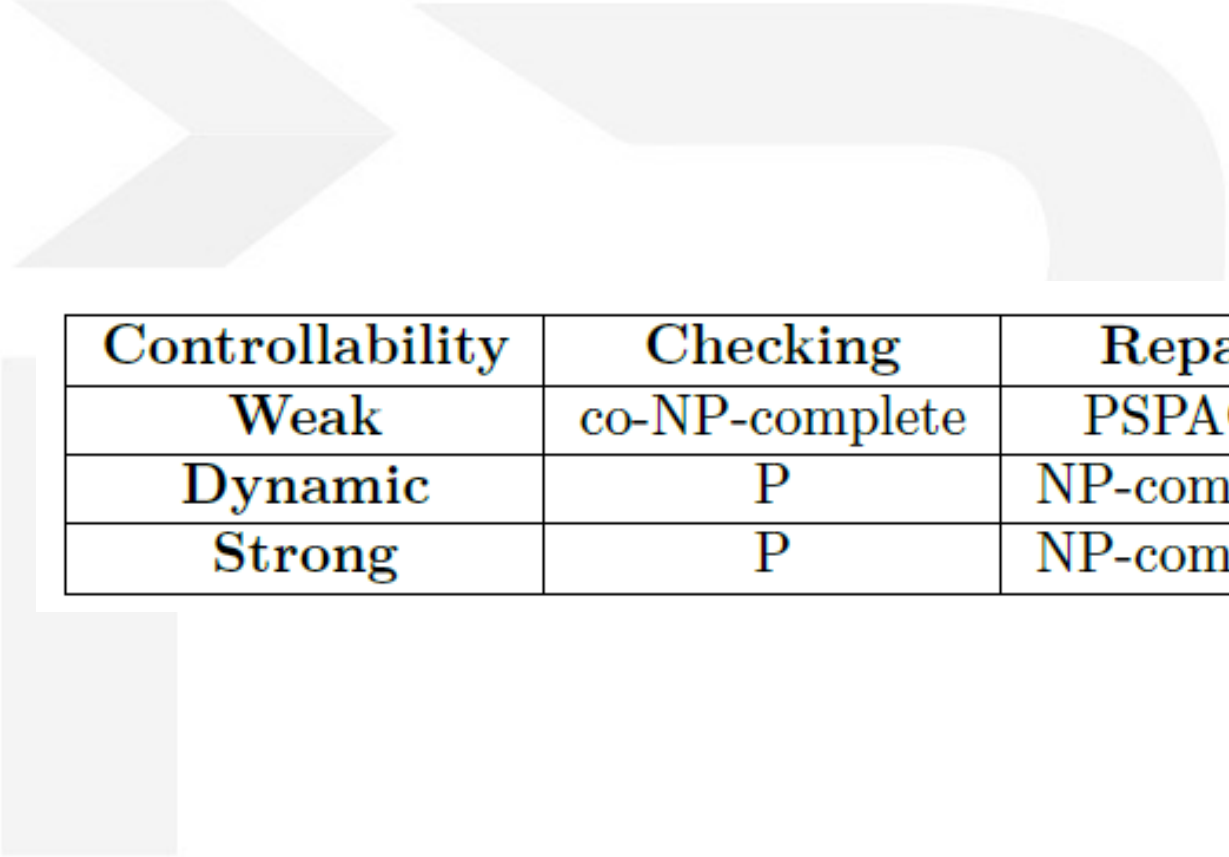
➔ **NP-complete !**

### Weak controllability (WC):

- Need to check all possible combinations of lower and upper bounds
- Checking one combination is co-NP-complete

➔ **PSPACE !**

# Model: MISTNU complexity



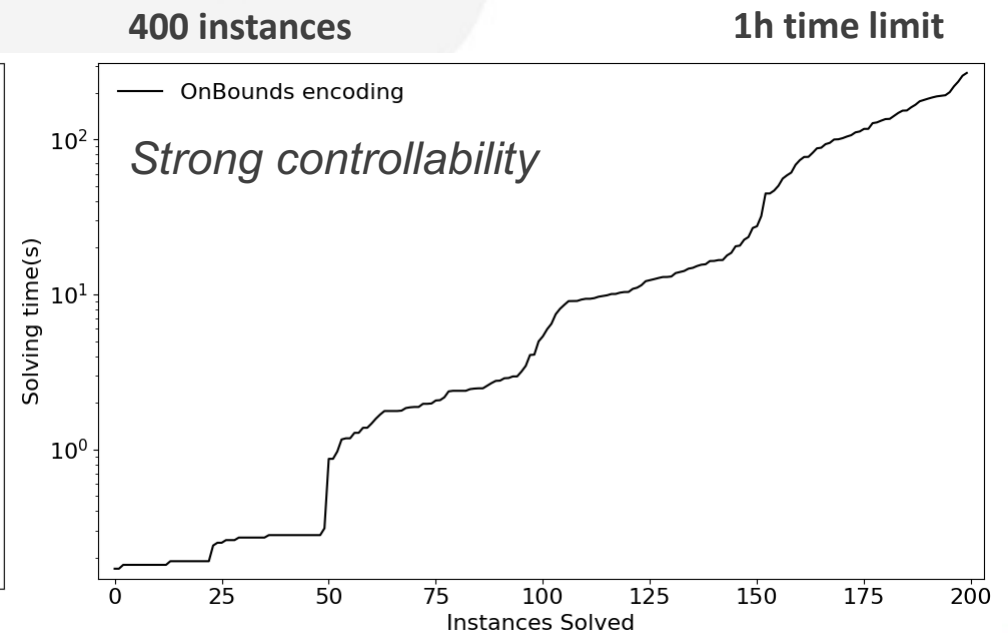
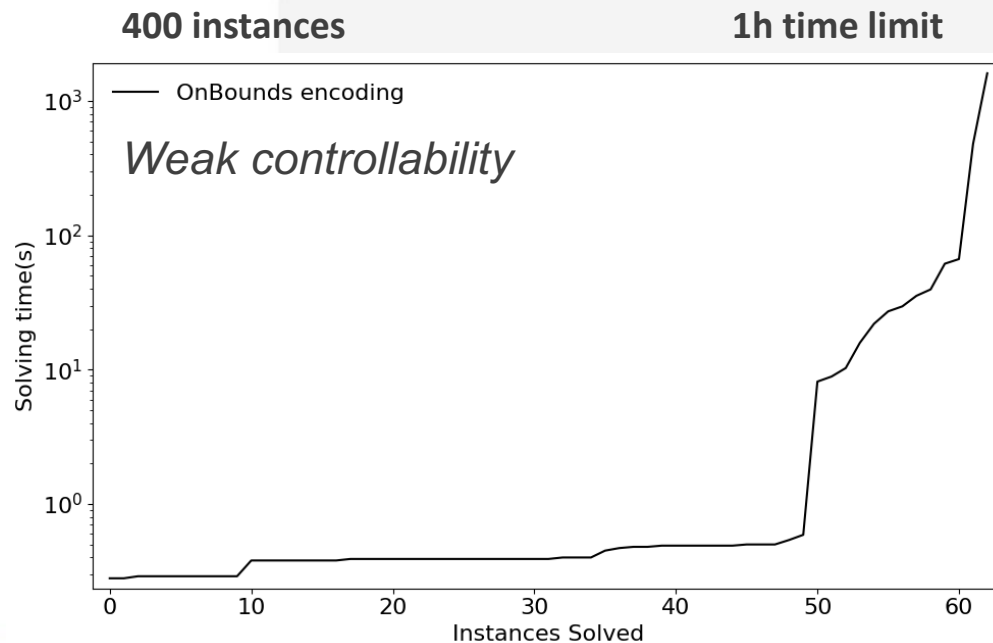
Controllability	Checking	Repair
Weak	co-NP-complete	PSPACE
Dynamic	P	NP-complete
Strong	P	NP-complete

# Model: MISTNU repair algorithms

## algorithms for the repair problem

### Centralized repair:

- SMT encoding for Weak and Strong controllability



# Conclusion

- Introduce a novel model for multi-agent Temporal Networks that can represent the (temporal) uncertainty that comes from another agent
- We introduce a novel problem for Temporal Networks which is the repair problem
- We proposed a first approach to solve the Weak and Strong repair problem
- Such model allow to refine plans by negotiating the duration of some tasks which allow to provide more flexible plans at the planning stage





**Thank you !**

**Time for questions**