



## **What killed the cat?** Towards a logical formalization of curiosity (and suspense and surprise) in narratives

---

Florence Dupin de Saint-Cyr   Anne-Gwenn Bosser   Benjamin Callac   Eric Maisel

31st International Symposium on Temporal Representation and Reasoning (TIME)  
Montpellier, Oct. 28-30, 2024

# Dramatic tension



- In a story, there's a very important thingy called dramatic tension.
- That means you don't let go of the action. You don't stop in the middle of your story to think.

<sup>1</sup>Heliotrope, tome 3 - "Le prix de mes larmes", Joann Sfar and Benjamin Chaud, 27 Septembre 2024, Dupuis, ISBN 9791034760404

1. Dramatic tension
2. Framework for analysing dramatic tension
3. Properties and graduality

## Dramatic tension

---

# Dramatic tension = 3 affects

According to [Baroni, 2007] 3 main ingredients:

- **Curiosity**: a crucial knowledge is omitted in the past or in the present
- **Suspense**: an impacting event can happen in the future
- **Surprise**: rupture from previous expectations

Other emotional mechanisms can also have an impact:

- Compassion/identification with a character of the story
- Familiarity with the universe of the story

- Dramatic tension affects  $\Rightarrow$  narrative engagement [Baroni, 2007]
- Narrative engagement  $\Rightarrow$  persuasion [Green and Brock, 2000]

convince (rational)  $\neq$  persuade (emotional)

- ▶ Discourse analysis: Identifying the emotions of dramatic tension
  - Make explicit persuasion mechanisms and communication objectives
  - Encourage critical thinking
- ▶ Discourse generation (under constraints)

# Narratology: the three levels

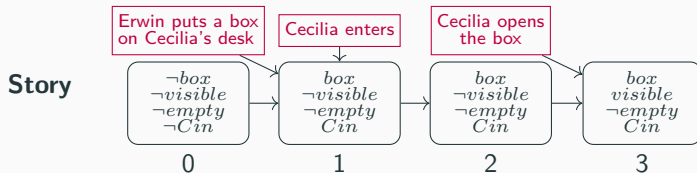
Telling a story = {  
1. **picking** events/properties of the story  
2. choosing **when** and how to tell them  
3. with a communicative goal in mind

**Discourse** *“Cecilia enters her office. She sees a closed box lying on her desk that was not there when she last left the room.”*

# Narratology: the three levels

Telling a story =  $\left\{ \begin{array}{l} 1. \text{ picking events/properties of the story} \\ 2. \text{ choosing when and how to tell them} \\ 3. \text{ with a communicative goal in mind} \end{array} \right.$

**Discourse** *“Cecilia enters her office. She sees a closed box lying on her desk that was not there when she last left the room.”*



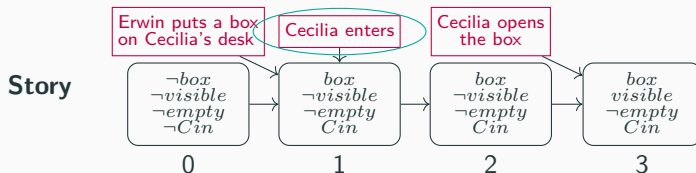


# Narratology: the three levels

Telling a story =  $\left\{ \begin{array}{l} 1. \text{ picking events/properties of the story} \\ 2. \text{ choosing when and how to tell them} \\ 3. \text{ with a communicative goal in mind} \end{array} \right.$

**Discourse** “*Cecilia enters her office. She sees a closed box lying on her desk that was not there when she last left the room.*”

**Narrative** [Cecilia enters<sub>1</sub> ; box<sub>1</sub> ;  $\neg$ visible<sub>1</sub> ;  $\neg$ box<sub>0</sub>]

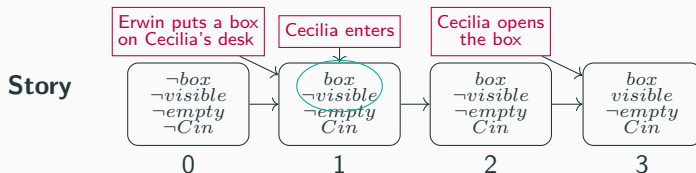


# Narratology: the three levels

Telling a story =  $\left\{ \begin{array}{l} 1. \text{ picking events/properties of the story} \\ 2. \text{ choosing when and how to tell them} \\ 3. \text{ with a communicative goal in mind} \end{array} \right.$

**Discourse** “Cecilia enters her office. *She sees a closed box lying on her desk that was not there when she last left the room.*”

**Narrative** [Cecilia enters<sub>1</sub> ; box<sub>1</sub> ;  $\neg$ visible<sub>1</sub> ;  $\neg$ box<sub>0</sub>]

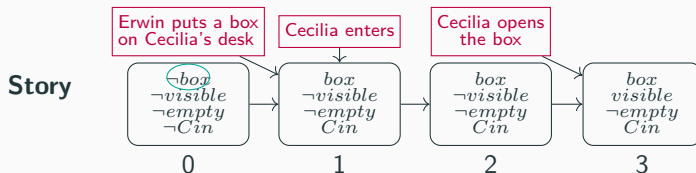


# Narratology: the three levels

Telling a story =  $\left\{ \begin{array}{l} 1. \text{ picking events/properties of the story} \\ 2. \text{ choosing when and how to tell them} \\ 3. \text{ with a communicative goal in mind} \end{array} \right.$

**Discourse** “Cecilia enters her office. She sees a closed box lying on her desk *that was not there when she last left the room.*”

**Narrative** [Cecilia enters<sub>1</sub> ; box<sub>1</sub> ;  $\neg$ visible<sub>1</sub> ;  $\neg$ box<sub>0</sub>]

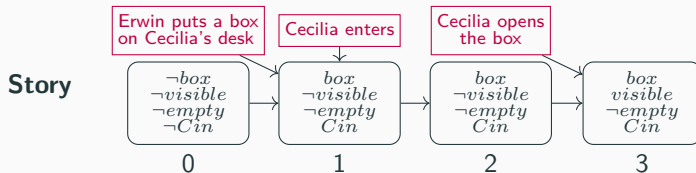


# Narratology: the three levels

Telling a story =  $\left\{ \begin{array}{l} 1. \text{ picking events/properties of the story} \\ 2. \text{ choosing when and how to tell them} \\ 3. \text{ with a communicative goal in mind} \end{array} \right.$

**Discourse** “Cecilia enters her office. She sees a closed box lying on her desk that was not there when she last left the room.”

**Narrative** [Cecilia enters<sub>1</sub> ; box<sub>1</sub> ;  $\neg$ visible<sub>1</sub> ;  $\neg$ box<sub>0</sub>]

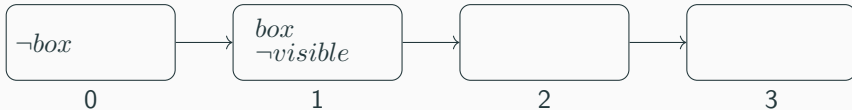


- Suspense:
  - [Baroni, 2007] “primary” suspense = uncertainty about what happens next in the story
  - [Cheong and Young, 2015] with Suspenser =  $\left\{ \begin{array}{l} \text{planning the various narrative elements} \\ + \text{maximize the suspense estimation} \end{array} \right.$
- Surprise:
  - [Shackle, 1961] surprise degree = impossibility degree of the event
  - [Dupin de Saint-Cyr and Prade, 2023] surprise in jokes: belief revision and defaults
- Curiosity ?

# The box story

*"Cecilia enters her office. She sees a closed box lying on her desk that was not there when she last left the room."*

Assumption: this short story can create **curiosity**, **suspense** and **surprise**.



# The box story: representation

- 3 agents only: Albert, Erwin and Cecilia
- Reasoning from the point of view of Cecilia

| Actions   | Fluents   |
|---|---|
| <ul style="list-style-type: none"><li>• <math>A</math> : Albert</li><li>• <math>E</math> : Erwin</li><li>• <math>C</math> : Cecilia opens the box</li></ul> | <ul style="list-style-type: none"><li>• <i>box</i>: there is a box on Cecilia's desk</li><li>• <i>empty</i>: the box is empty</li><li>• <i>visible</i>: Cecilia sees something in the box</li></ul> |

- Close world assumption: no change unless one of the three actions is done

## Framework for analysing dramatic tension

---



# Epistemic state

- Dramatic tension affects depends on the **beliefs** and **reasoning** of the agent
- Restriction: we consider only **the story level**
- **Epistemic state**  $S = (F, S_{\mathcal{L}}, S_{\Delta})$
- Example: Cecilia's epistemic state

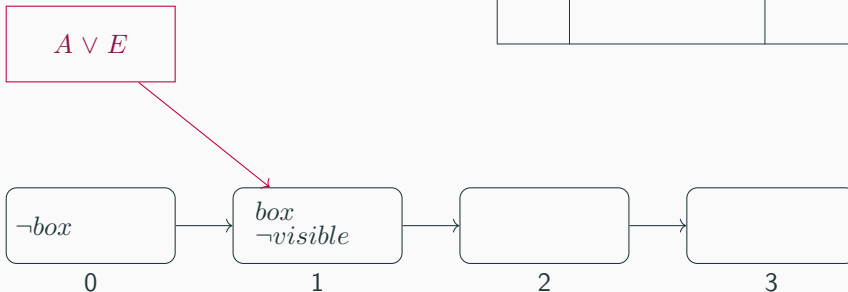
| Facts            | Strict Rules  | Defeasible Rules   |
|------------------|---|--|
| $\neg box_0$     | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$<br>$(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$ |
| $box_1$          |   | $\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$                     |
| $\neg visible_1$ |   | $\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$                  |
|                  |   | $\neg box_t \rightsquigarrow \neg box_{t+1}$                                   |
|                  |   | $box_t \rightsquigarrow box_{t+1}$   |
|                  |   | $\neg visible_t \rightsquigarrow \neg visible_{t+1}$                           |
|                  |   | $\vdots$   |

## Definition (awareness)

An agent, represented by its epistemic state  $S = (F, S_{\mathcal{L}}, S_{\Delta})$ , is *aware* of variable  $v \in \mathcal{V}$  if

- $v$  appears inside a fact formula of  $F$  or
- $v$  appears inside a rule of  $S_L \cup S_{\Delta}$  containing a variable the agent is already aware of.

# The box story (continued)



| Facts            | Stric Rules  | Defeasible Rules   |
|------------------|--|--|
| $\neg box_0$     | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$ |
| $box_1$          | $(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$    | $\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$                     |
| $\neg visible_1$ |  | $\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$                  |
|                  |  | $\neg box_t \rightsquigarrow \neg box_{t+1}$                                   |
|                  |  | $box_t \rightsquigarrow box_{t+1}$   |
|                  |  | $\neg visible_t \rightsquigarrow \neg visible_{t+1}$                           |
|                  |  | $\vdots$   |

Cecilia's epistemic state

- Cecilia's is **aware** of *box* and *visible* hence given her beliefs she is aware of *A*, *E*, *C*, *empty*
- Cecilia can infer  $A_0 \vee E_0$  from her beliefs

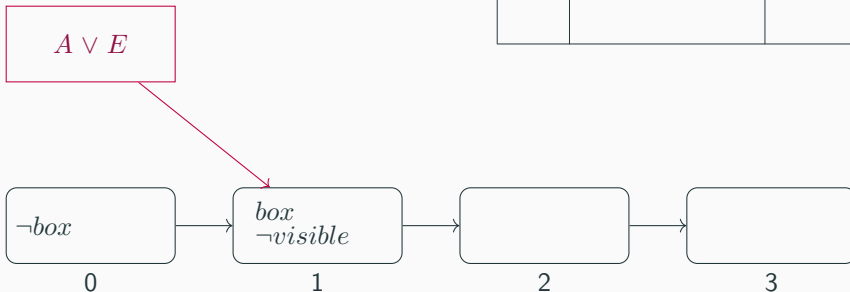
## Definition (curiosity)

An agent with state  $S$  is *curious about*  $\varphi \in \mathcal{L}$  at  $t \in T$  if,

1. according to  $S_{\rightarrow t}$  ( $S$  until  $t$ ) she is aware of (all variables of)  $\varphi$  and
2. at time  $t$ , she is unable to infer the value of  $\varphi$ :
  - $\not\models_{S_{\rightarrow t}} \varphi$  and
  - $\not\models_{S_{\rightarrow t}} \neg\varphi$

$\models_S$  being the lexicographic non-monotonic inference operator based on the epistemic state  $S$

# Curiosity (example)



| Facts            | Strict Rules   | Defeasible Rules   |
|------------------|--|--|
| $\neg box_0$     | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$ |
| $box_1$          | $(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$    | $\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$                     |
| $\neg visible_1$ |  | $\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$                  |
|                  |  | $\neg box_t \rightsquigarrow \neg box_{t+1}$                                   |
|                  |  | $box_t \rightsquigarrow box_{t+1}$   |
|                  |  | $\neg visible_t \rightsquigarrow \neg visible_{t+1}$                           |
|                  |  | $\vdots$   |

Cecilia's epistemic state

- Cecilia is **curious** about who put the box there ( $A$  or  $\neg A$ ?)
- Cecilia is **curious** about the content of the box ( $empty$  or  $\neg empty$ ?)

## Definition (suspense)

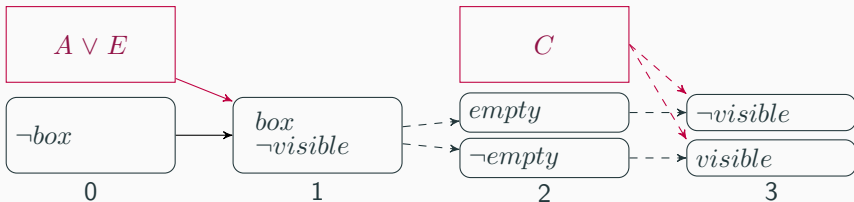
An agent in state  $S = (F, S_{\mathcal{L}}, S_{\Delta})$  feels *suspense about*  $\varphi \in \mathcal{L}$  at time point  $t$  if

- according to  $S$ , the agent is *curious about*  $\varphi$  at time  $t$  and
- the agent is aware of a formula  $\psi$  consistent with  $S$  until  $t$  and
- $\psi$  enables the agent to infer either  $\varphi$  or  $\neg\varphi$  in  $t' > t$   
i.e.,  $\vdash_{S'} \varphi_{t'}$  or  $\vdash_{S'} \neg\varphi_{t'}$  holds, with  $S' = (F \cup \{\psi\}, S_{\mathcal{L}}, S_{\Delta})$ .

# Suspense (example)

| Facts            | Strict Rules   | Defeasible Rules   |
|------------------|--|--|
| $\neg box_0$     | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$ |
| $box_1$          | $(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$    | $\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$                     |
| $\neg visible_1$ |  | $\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$                  |
| $C_2$            |  | $\neg box_t \rightsquigarrow \neg box_{t+1}$                                   |
| $visible_3$      |  | $box_t \rightsquigarrow box_{t+1}$   |
|                  |  | $\neg visible_t \rightsquigarrow \neg visible_{t+1}$                           |
|                  |  | $\vdots$   |

Cecilia's epistemic state



Cecilia feels **suspense** at time 1 about whether she will know if the box is empty or not

## Definition (surprise)

An agent represented by  $S = (F, S_{\mathcal{L}}, S_{\Delta})$  is *surprised at time  $t$  about a formula  $\varphi \in \mathcal{L}$*  if

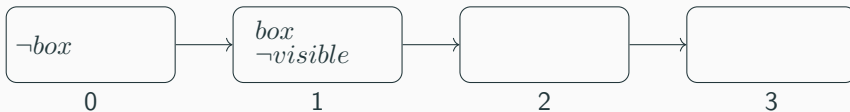
1.  $\varphi \in F_{\rightarrow t}$  and  $S_{\rightarrow t}$  is consistent ( $\varphi$  occurred and it was not impossible) but
2.  $S' = (F_{\rightarrow t-1}, S_{\mathcal{L} \rightarrow t}, S_{\Delta \rightarrow t})$  is such that:  $\vdash_{S'} \neg \varphi$  (from  $t-1$ ,  $\neg \varphi$  was expected)



# Surprise (example)

| Facts                                       | Stric Rules   | Defeasible Rules  |
|---|---|---|
| $\neg box_0$<br>$box_1$<br>$\neg visible_1$ | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$<br>$(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$<br>$\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$<br>$\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$<br>$\neg box_t \rightsquigarrow \neg box_{t+1}$<br>$box_t \rightsquigarrow box_{t+1}$<br>$\neg visible_t \rightsquigarrow \neg visible_{t+1}$<br>$\vdots$ |

Cecilia's epistemic state



Cecilia is **surprised** at time 1

## Properties and graduality

---

# Properties derived from the definitions

## Propositions 1 & 2

No fact known  
Only one most plausible interpretation }  $\Rightarrow$  No curiosity nor suspense

## Proposition 3

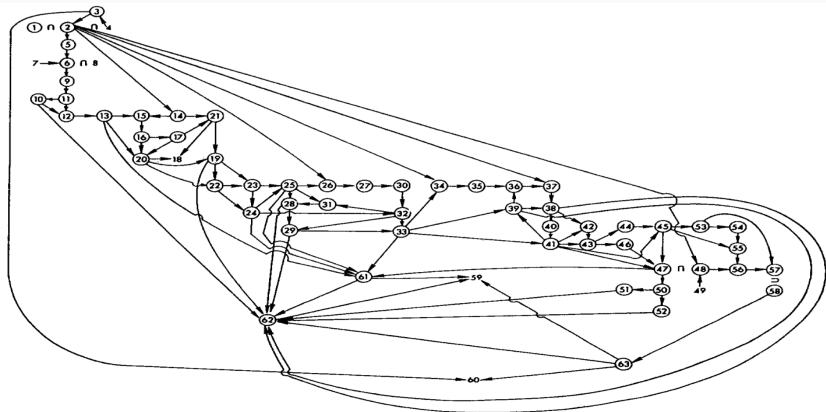
Surprise about  $\varphi$  at  $t$   $\Rightarrow$  No curiosity about  $\varphi$  neither at  $t - 1$  nor at  $t$

## Proposition 4

Deciding whether

- an agent is aware of a variable/formula is linear
- an agent is curious, feels suspense or surprise about a formula is  $P^{NP}$ -complete

# Towards defining measures: importance of events



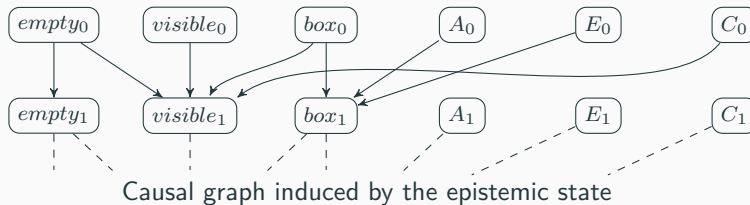
Causal graph for *The Father, His Son and Their Donkey*

The **perceived importance of events** in a story is related to the **degree** of the associated vertex in the causal graph [Trabasso and Sperry, 1985].

# Towards defining measures: curiosity degree

| Facts                                       | Strict Rules  | Defeasible Rules  |
|---|---|---|
| $\neg box_0$<br>$box_1$<br>$\neg visible_1$ | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$<br>$(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$<br>$\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$<br>$\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$<br>$\neg box_t \rightsquigarrow \neg box_{t+1}$<br>$box_t \rightsquigarrow box_{t+1}$<br>$\neg visible_t \rightsquigarrow \neg visible_{t+1}$<br>$\vdots$ |

Cecilia's epistemic state



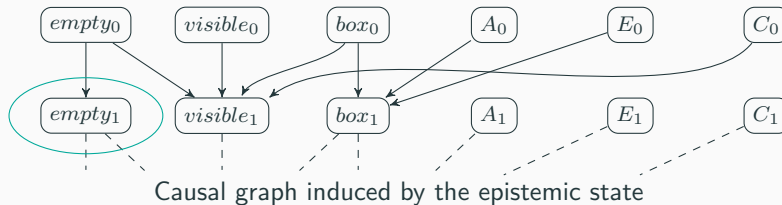
## Definition (Curiosity intensity)

$Curiosity\ degree(formula) = \text{sum of its variable degrees in the causal graph}$

# Towards defining measures: curiosity degree

| Facts                                       | Strict Rules  | Defeasible Rules  |
|---|---|---|
| $\neg box_0$<br>$box_1$<br>$\neg visible_1$ | $(\neg box_t \wedge box_{t+1}) \rightarrow (A_t \vee E_t)$<br>$(\neg visible_t \wedge visible_{t+1}) \rightarrow C_t$ | $\neg visible_t \wedge C_t \wedge empty_t \rightsquigarrow \neg visible_{t+1}$<br>$\neg visible_t \wedge C_t \rightsquigarrow visible_{t+1}$<br>$\neg box_t \wedge (A_t \vee E_t) \rightsquigarrow box_{t+1}$<br>$\neg box_t \rightsquigarrow \neg box_{t+1}$<br>$box_t \rightsquigarrow box_{t+1}$<br>$\neg visible_t \rightsquigarrow \neg visible_{t+1}$<br>$\vdots$ |

Cecilia's epistemic state

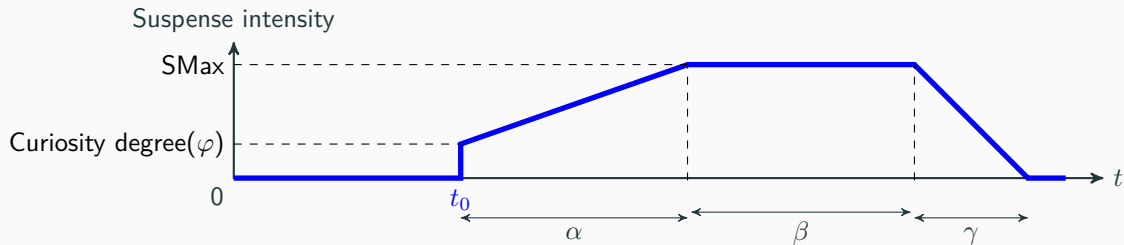


## Definition (Curiosity intensity)

*Curiosity degree(formula)* = sum of its variable *degrees* in the causal graph

*Example:* *Curiosity degree(empty<sub>1</sub>)* = 3

## Towards defining measures: Suspense intensity



### Definition

Given an epistemic state  $S = (F, S_{\mathcal{L}}, S_{\Delta})$  and a *suspense profile*  $p = (\alpha, \beta, \gamma, S_{\text{Max}})$

Without revival nor resolution, *suspense degree*( $\varphi$ ) follows the *pattern*

where  $t_0$  = earliest time where the agent was curious about  $\varphi$ .

[Shackle, 1961] = degree of impossibility of  $\varphi$

## Definition (surprise intensity)

Given an epistemic state  $S = (F, S_{\mathcal{L}}, S_{\Delta} = \Delta_1 \dots \Delta_n)$  with a *surprise* about  $\varphi$

$$\text{Surprise degree}(\varphi) = n - i$$

where  $i$  is the most specific strata with a rule violated by  $\varphi$



## Conclusion

---

- Preliminary study
- Framework for formalizing the emotions at the heart of dramatic tension
- Unified framework for the 3 emotions: **curiosity**, **suspense** and **surprise** + their relationships
- Framework built on non-monotonic reasoning (NMR)
  - Compact language for simulating default reasoning of an agent under incomplete information
  - NMR (lexicographic inference) induces a cost in complexity: problems in  $P^{NP}$
  - Measures of intensity for the three affects

- Discourse analysis
  - Implement this model in different frameworks:  
PDDL [Ghallab et al., 1998]   Ceptre [Martens, 2015]   ToulST [Slimane et al., 2015]
  - Find benchmarks of stories annotated with emotions
  - Integrate the three levels (discourse, narrative sequence, story)
  - Extend to other emotions in OCC theory  
[Ortony et al., 1988, Lorini and Schwarzentruher, 2011, Adam et al., 2009]
  - Build causal graphs associated to stories (narrative closure)
  - ▶ DEMA<sup>2</sup>IN project: deconstructing affective and argumentative persuasion mechanisms in digital influence campaigns
- Discourse generation
  - Adaptation to the user
  - Interactive storytelling: maintain both causal and affective coherence

# References

-  Adam, C., Herzig, A., and Longin, D. (2009).  
**A logical formalization of the OCC theory of emotions.**  
*Synthese*, 168(2):201–248.
-  Baroni, R. (2007).  
***La tension narrative: suspense, curiosité et surprise.***  
Poétique. Éd. du Seuil, Paris.
-  Cheong, Y.-G. and Young, R. M. (2015).  
**Suspenser: A Story Generation System for Suspense.**  
*IEEE Transactions on Computational Intelligence and AI in Games*, 7(1):39–52.
-  Dupin de Saint-Cyr, F. and Prade, H. (2023).  
**Belief revision and incongruity: Is it a joke?**  
*Journal of Applied Non-Classical Logics*, 33(3-4):467–494.
-  Ghallab, M., Howe, A., Knoblock, C., McDermott, D., Ram, A., Veloso, M., Weld, D., and Wilkins, D. (1998).  
**PDDL – the planning domain definition language.**  
AIPS-98 Planning Competition Committee CVC TR-98-003/DCS TR-1165, Yale Center for Computational Vision and Control.
-  Green, M. and Brock, T. (2000).  
**The Role of Transportation in the Persuasiveness of Public Narrative.**  
*Journal of personality and social psychology*, 79:701–21.
-  Lorini, E. and Schwarzenruber, F. (2011).  
**A logic for reasoning about counterfactual emotions.**  
*Artificial Intelligence*, 175(3):814–847.
-  Martens, C. (2015).  
**Ceptre: A language for modeling generative interactive systems.**  
In *Proceedings of the AAAI Conference on Artificial Intelligence and Interactive Digital Entertainment*, volume 11, pages 51–57.
-  Ortony, A., Clore, G. L., and Collins, A. (2022 (original work published 1988)).  
***The cognitive structure of emotions.***  
Cambridge university press.
-  Shackle, G. L. S. (1961).  
***Decision, Order and Time in Human Affairs.***  
(2nd edition), Cambridge University Press, UK.
-  Slimane, K. S. B., Comte, A., Gasquet, O., Heba, A., Lezaud, O., Maris, F., and Valais, M. (2015).  
**Twist your logic with ToulST.**  
*CoRR*, abs/1507.03663.
-  Trabasso, T. and Sperry, L. L. (1985).  
**Causal relatedness and importance of story events.**  
*Journal of Memory and Language*, 24(5):595–611.