# What time is it? Temporal grounding in movies

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## **Motivation**

Humans can instinctively understand the timeline in a film and sort events, even without explicit mentions. They can relate visual cues to corresponding contextual information that could be multi-modal (audiovisual, dialogue), and draw on background knowledge when interpreting and grounding a stream of scenes or videos. For instance, imagine you are watching the movie Titanic: In the beginning (1996), an old lady (Rose) is talking with the crew that searches the wreck of Titanic. They recover a safe that contains a drawing of a woman wearing a necklace. Suddenly, the story jumps to 1912 where a group of people is playing poker and Jack wins a Titanic ticket (first two frames in Figure 1 (top)). Such a dramatic change of scenes plays an important role in the storytelling [Brown21]. Typically, a film is composed of a well-designed series of scenes with transitions, where the underlying storyline based on characters' interactions determines the order of the scenes [Kukleva20]. Therefore, recognizing scenes in films, understanding their content and sorting them in chronological order is essential for a wide range of storytelling applications (Figure 1). However, most computer vision approaches focus on answering specific questions [Pardo21,Tapaswi16]. Only a couple of recent works [Fu22,Yang22] target understanding time; these, however, focus on images and do not account for the relative order of sequences, especially for long-range reasoning [Wu21].



Figure 1. Storyline in edited videos. (top) Titanic scenes in filmed order; (bottom) Temporal grounding in sequences: scenes ordered chronologically, from past (green arrow) to present (red arrow)

# **Project description**

This project falls into the cutting-edge video understanding domain and aims at understanding the storyline in movies. For this, we will formulate the problem of temporal grounding in videos. Specifically, given long-range video scenes, we will propose state-of-the-art methods to order all scenes chronologically (Figure 1 (bottom)) by exploiting multimodal cues (video, audio, text).

## Requirements

We are looking for strongly motivated candidates with an interest in machine learning and computer vision. The project requires a strong background in applied mathematics and excellent programming skills (mostly in Python). If we find a mutual match, the project can lead to a joint PhD in video understanding at Ecole Polytechnique and in the Willow Group of Inria Paris.

#### References

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