

# Deep Relationship Analysis in Video with Multimodal Feature Fusion



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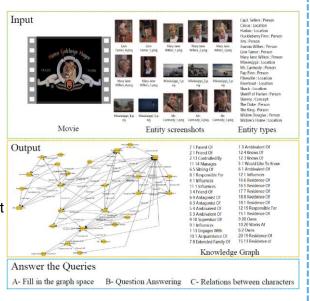
## **Task & Dataset**

### **Deep video understanding (DVU)**

- requires the analysis of known information to reason about hidden information
- populates a knowledge graph of a long duration video with example screenshots and types of the entities

#### **HLVU** dataset

- 10 videos, 6 for development and 4 for test
- entity name, type and screenshot
- 59 predefined relationships
- · knowledge graph



## Solution

- Scene segmentation
- Person tracking & recognition
- · Location recognition
- Auto subtitles->text features
- Audio features
- · Vision features
- Multimodal features fusion
- · Zero-shot learning
- · Entity-relationship graph
- · Query answering

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[ Scene 1 ] [	Scene 2 ] [	Scene 3		[ Scene n ]
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text feature aud	io feature	entity feature	entity feature	union feature
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		MACADO (1900)	Friend	
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## **Experiments**

Method	R@50	R@100	$R@\theta$
T+E/+C/+C+N	2.959/5.325/8.876	9.467/10.651/17.160	2.367/3.550/9.467
T+E+U/+C/+C+N	8.876/9.467/14.201	<b>10.651</b> / <b>11.834</b> /17.160	7.692/ <b>8.284</b> / <b>11.834</b>
A+E/+C/+C+N	2.367/2.959/8.284	8.284/11.243/17.160	2.367/2.959/8.284
A+E+U/+C/+C+N	0.592/1.775/8.284	2.959/8.284/13.018	0.592/1.183/7.692
T+A+E/+C/+C+N	<b>9.467</b> /9.467/ <b>14.793</b>	$10.059/\mathbf{11.834/17.751}$	8.284/8.284/10.651
T+A+E+U/+C/+C+N	<b>9.467</b> /10.059/14.793	<b>10.651</b> /11.243/ <b>17.751</b>	5.917/7.101/ <b>11.834</b>
C+N	8.284	13.609	7.692
T: text feature, A: audio fea	ature, E: entity vision feature, U	J: union vision feature, C: cate	gory rule, N: name rule

	Fill in the graph space	Question Answering	Relations between characters
Shooter	0.555555	1.0	0.0,0.0,NaN,0.0,0.0,NaN
Sophie	0.3616558	0.875	0.0,0.0,NaN,0.0,0.0,NaN,0.0,0.0,NaN, 0.0,0.0,NaN,0.0,0.0,NaN,0.0,0.0,NaN
Time Expired	0.33025533	0.5	0.0,0.0,NaN,0.0,0.0,NaN,0.0,0.0,NaN, 0.0,0.0,NaN,0.0,0.0,NaN,0.0,0.0,NaN
The Big Something	0.5083333	0.75	0.0,0.0,NaN,0.0,0.0,NaN