



### Multimodal info is everywhere (text, images, videos...)

2019

2020

2021



Mar 29, 2020: A person is **taken** on a stretcher into **treatment** after going through testing for the coronavirus in Houston, Texas, March 19, 2020. (AP/David J. Phillip)....





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Oct 18, 2022: Parents rally at State Capitol in **protest** of upcoming COVID-19 vaccine mandates. Whitney Jiusti, a parent from Espardo, and **her two children attend the protest** on Oct. 18 at the California State Capitol.



2023

2022

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What happened?





What happened?

Yes! A protest.

What are they protesting for?







What happened?

Yes! A protest.

What are they protesting for?



vaccine













Image / VideoFrame

Image

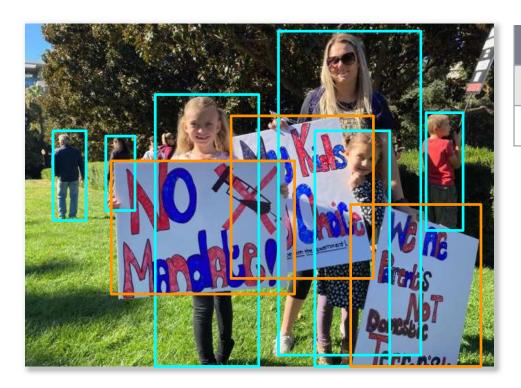


Image / VideoFrame		
Image		
Object		

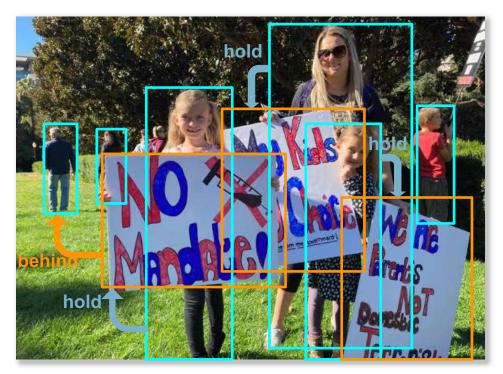


Image / VideoFrame
Image
Object
Relation
Scene Graph

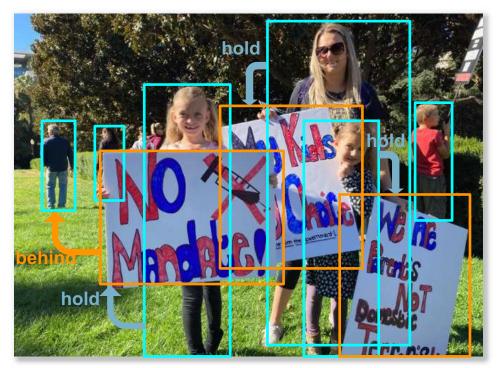


Image / VideoFrame	Text
Image	Sentence
Object	Entity
Relation	Relation
Scene Graph	Entity-Relation Graph



	Image / VideoFrame		Text
		Image	Sentence
	ntity-	Object	Entity
	entric		Relation
ı	Scene Graph		Entity-Relation Graph

#### State-of-the-art Captioner (Kamath et al., 2022)

Answer \$

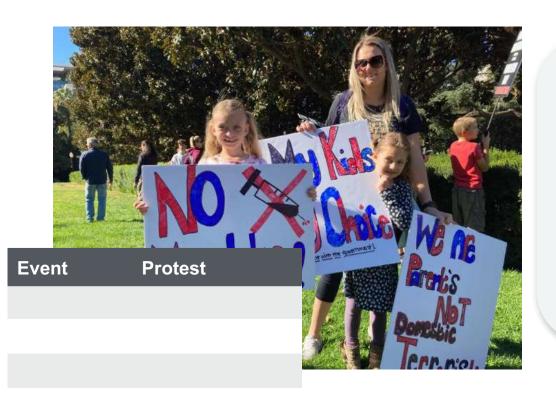
a woman holding a sign in front of a group of people.

a woman holding a sign while standing in a park.

a woman holding a sign in front of a crowd.

### My Research Vision: Surface → Deep

### **Deep Semantic Understanding:**

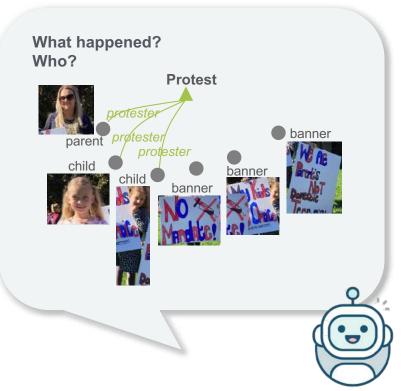




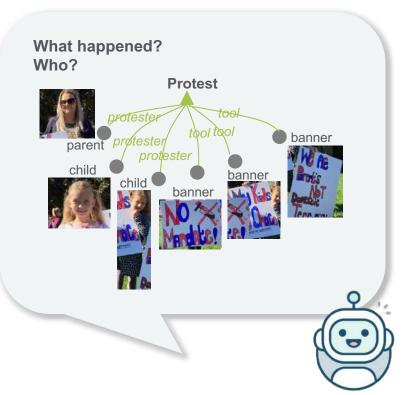












#### What is Multimodal Event Extraction?

# **Multimodal Event Extraction [ACL'20]**

Input: text, image, video, speech, ...

Output: structured knowledge

- 1. Event Type: identify the occurrence of certain event
- 2. Argument: Identify the participants and their semantic roles



	Text	Image / VideoFrame
	Sentence	Image
Entity		Object
Entity- centric Relation		Relation
Entity-Relation Graph		Scene Graph





# **Entity-centric**

# **Event-centric**

**Surface** 

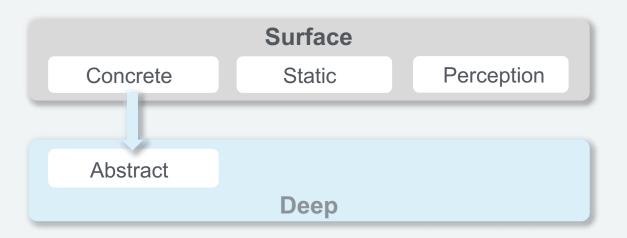
Deep

### **Deep Semantic Understanding:**

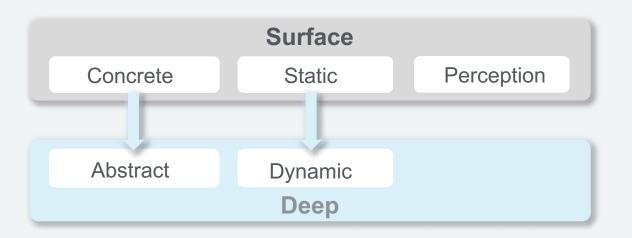
### **Deep Semantic Understanding:**



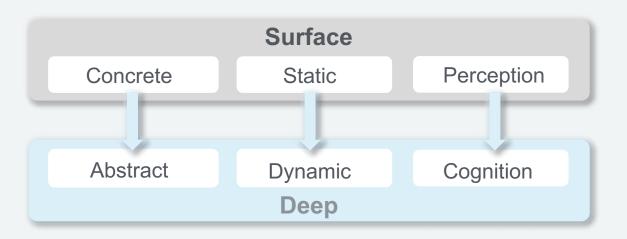
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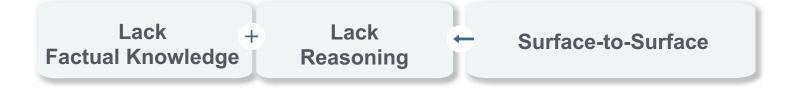
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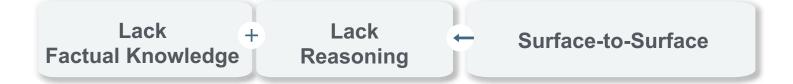
Text generation paradigm (e.g., ChatGPT) is taking over the NLP world.

But it is flat and surface-to-surface.

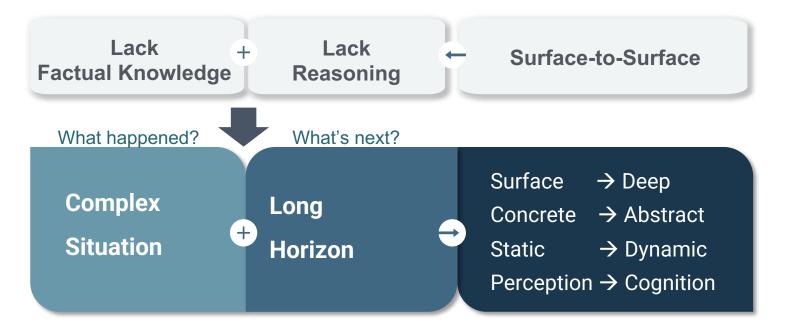
**Surface-to-Surface** 

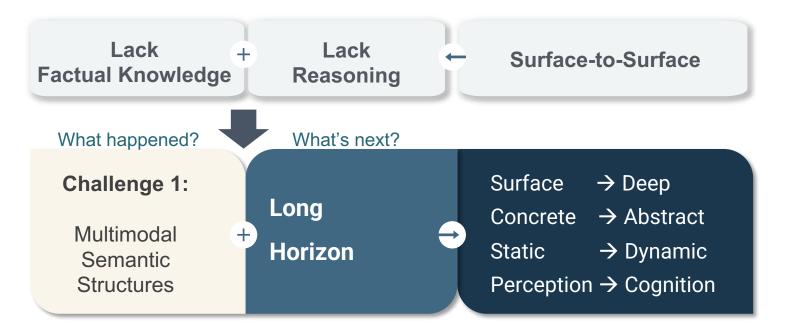


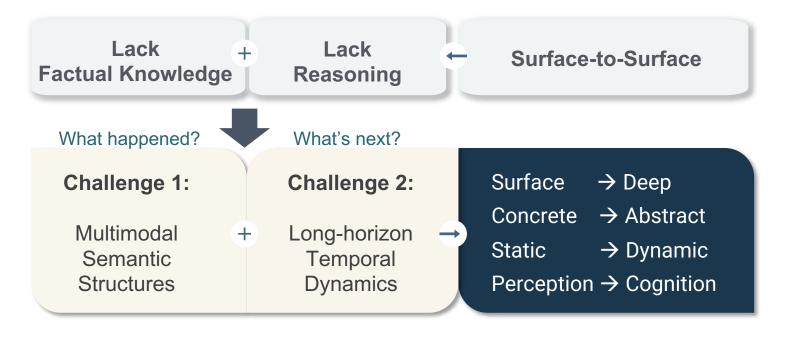
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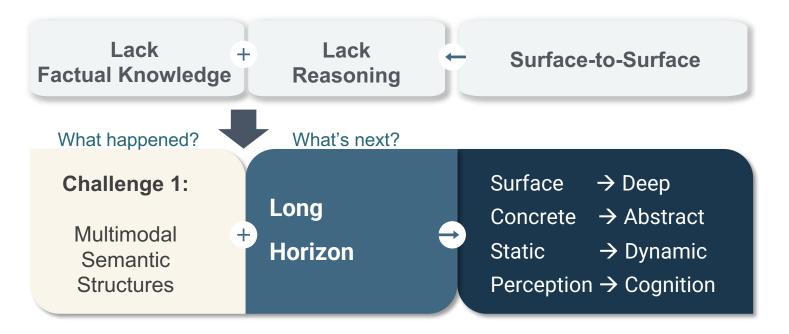


Surface → Deep
Concrete → Abstract
Static → Dynamic
Perception → Cognition









# **Challenge 1: Multimodal Semantic Structures**



What happened?

Who?

Where?

When?



### **Challenge 1: Multimodal Semantic Structures**

### - My Solution: We propose the first Multimodal Event Extraction model



Event	Protest
Protester	parent
Protester	child
Tool	banner
Topic	No vaccine mandate for kids
Location	California State Capitol
Time	Oct 18

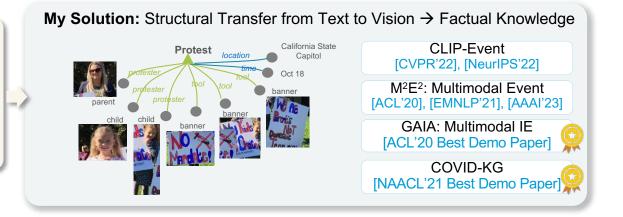
**Caption:** Whitney Jiusti, a parent from Espardo, and her two children attend the protest on Oct. 18 at the California State Capitol.

## From Entity-centric to Event-centric Multimodal Knowledge Acquisition

### Read: Complex Situation

### **Challenge 1:**

Multimodal Semantic Structures

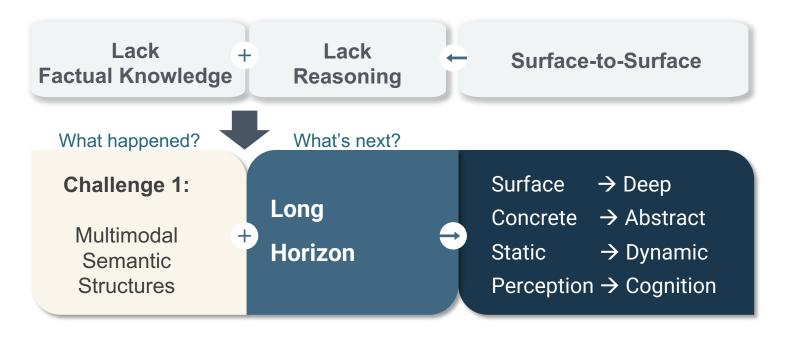


### **Challenge 2:**

Long-horizon Temporal Dynamics

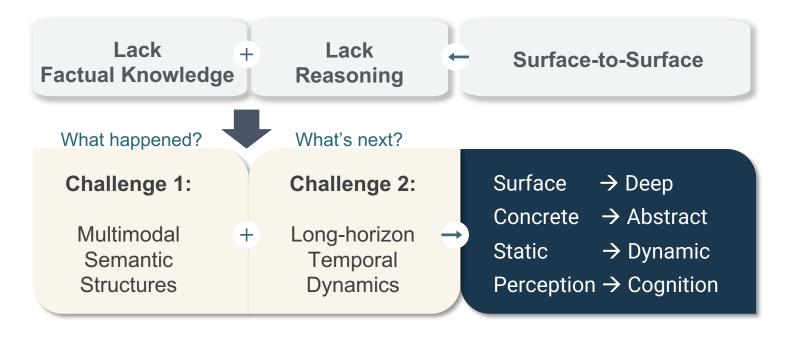
# My Research Vision: Surface → Deep Knowledge

Text generation paradigm (e.g., ChatGPT) is taking over the NLP world. But it is flat and surface-to-surface.



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Text generation paradigm (e.g., ChatGPT) is taking over the NLP world. But it is flat and surface-to-surface.





**Caption:** Whitney Jiusti, a parent from Espardo, and her two children attend the protest on Oct. 18 at the California State Capitol.

What happened?

Who?

Where?

When?

Why?

What will happen next?





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Long Context →

Lose focus
Fail to aggregate

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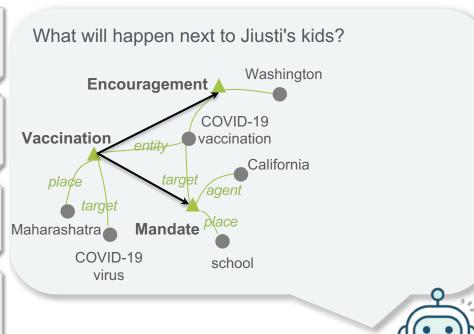


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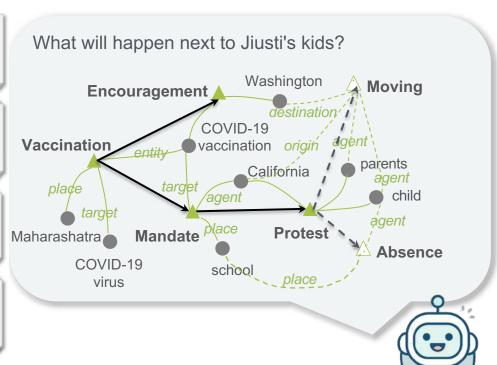


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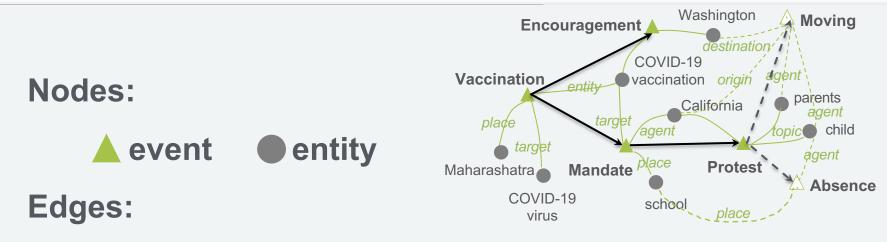


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# What is Event Knowledge Graph?



- <u>A</u>→ temporal: <event event>
- argument: <event entity>
- relation: <entity entity>

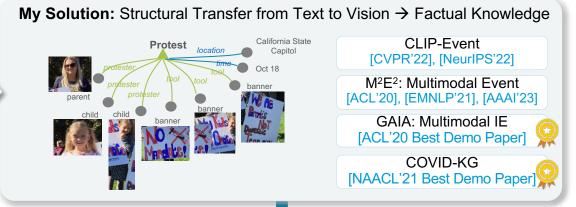
## From Entity-centric to Event-centric Multimodal Knowledge Acquisition

## Read: Complex Situation

### **Think**: Temporal Pattern

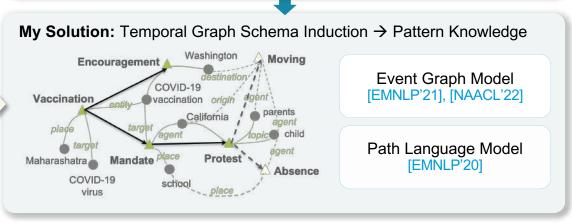
### **Challenge 1:**

Multimodal Semantic Structures



### **Challenge 2:**

Long-horizon Temporal Dynamics



Read: Complex Situation

Think: Temporal Pattern

Write: Truthfully

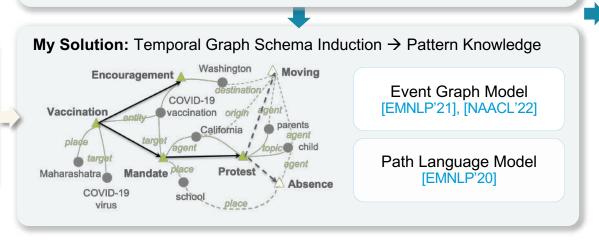
### **Challenge 1:**

Multimodal Semantic Structures



### **Challenge 2:**

Long-horizon Temporal Dynamics



### **Truthful Generation**

### My Solution:

Knowledge-Driven Generation

Timeline Summarization [EMNLP'21]

COVID-19 Claim Detection [ACL'22]

> Multimedia News QA [AAAI'22]

Meeting Summarization [ACL'19]

> Event Heatmap [NAACL'19]

# Live Demo: What Would the "SmartBook" Look Like? An Example Chapter

**Ukraine Crisis Smart Book** 



Ukraine-Russia conflict?

What is the position of China on the Ukraine-Russia conflict?

What is the position of the governments of Poland, Turkey and Moldova on the Ukraine-Russia conflict?

What is Venezuela's position on Ukraine-Russia Conflict?

Perspectives

### What is the position of China on the Ukraine-Russia conflict?

#### Summary

China has publicly stated that it does not support the idea of ejecting Russia from the G20, and has instead called for dialogue between all parties involved in the conflict. China has also said that it is opposed to the spread of disinformation about China in an attempt to pressure the country.

#### Claims

Claim Sentence	Context
Since the war began, China has tried to project a neutral stance. Source	Biden-Xi call: A call between Chinese President Xi Jinping and US President Joe Biden was underway Friday. Since the war began, China has tried to project a neutral stance. It has not condemned Russian actions, and has refused to label the attack an invasion. See More
Cooperation with China was ambivalent, he said, adding the country was "struggling with the consequences of its own Covid strategy, which also has consequences for world trade."	While the G7 leaders reemphasized their condemnation of "Russia's unjustifiable, unprovoked and illegal war against Ukraine," they called on China to press Russia to withdraw its troops from Ukraine. Scholz said he also expected China not to undermine sanctions against Russia. Cooperation with China was ambivalent, he said, adding the country was "struggling with the consequences of its own Covid strategy, which also has consequences for world trade." See More
China is firmly opposed to this and will never accept it. Source	The US has indicated that China would pay an economic price if its support for Russia goes beyond rhetoric. Speaking Friday, Zhao repeated China's public rebuke, saying "some people in the US have been spreading disinformation to smear and put pressure on China, which is extremely irresponsible and will not help solve the issue. China is firmly opposed to this and will never accept it." See More
That is considered unlikely, as China has said it would not back cicking Russia out.	While US President Joe Biden has said Russia should no longer be in the G20, ejecting Moscow would require the support of all members. That is considered unlikely, as China has said it would not back kicking Russia out. See More
The White House is realistic the G20 will not collectively remove Russia from its ranks, since the decision would likely require consensus and China has been clear it doesn't support such a move.	The White House is realistic the G20 will not collectively remove Russia from its ranks, since the decision would likely require consensus and China has been clear it doesn't support such a move. See More

#### **Multi-Lingual Claims**

China's position:

Source

#### Original Pos

中國常驻联合國副代表耿爽:各方都应摒弃政治私利,为化解乌克兰危机做切实努力。中國日报联合國9月7日电(记者张旻璐)当地时间7日、联合國安理会召开合议审议乌克兰人道问题。中国常驻联合国副代表耿爽出席会议并发言表示。乌克 弃政治私利,停止聚化矛盾、停止制造分裂、停止鼓吹对抗。为化解危机做出切实努力、耿爽说、历史反复证明、外交努力、谈判沟通是化解冲突、结束危机的唯一正确比路。中方再次呼吁有关当事方保持对话接触。探索政治解决的可能性。 复和平稳定积累条件。 耿爽指出,扎波罗热核电站的安全和安使国事关乌克兰和整个地区上亿人的健康组计,决不容许发生意外。中方呼吁有关当事方认真落实格罗西总干事提出的七项支柱原则,避免采取危及核安全和安保的行动。中方对 问团上周时扎波罗热核电站进行实地考察。 赞赏机均专家驻留在核电站继续开展工作。鼓励机构软相关问题同各方保持沟通。

#### Translation (Google)

Geng Shuang, Deputy Permanent Representative of China to the United Nations: All parties should abandon political self-interest and make practical efforts to resolve the Ukrainian crisis China Dally, United Nations, September 7 (Reporter ZI 7th local time, the UN Security Council held a meeting to discuss the humanitarian issue in Ukraine, China's Deputy Permanent Representative to the United Nations, Geng Shuang, attended the meeting and said that all parties in the Ukraine

SmartBook: <a href="https://blenderdemo.com/smartbook">https://blenderdemo.com/smartbook</a>

ClaimRadar for COVID19: https://blenderdemo.com/covid-list



What is the position of

China on the Ukraine-Russia conflict?

Multi-Lingual Claims

Original Post

Translation (Google)

Summary

Claims:

# Live Demo: What Would the "SmartBook" Look Like? An Example Chapter

**Ukraine Crisis Smart Book** 

Sep 16th - 30th

Oct 1st - 15th

Oct 16th - 30th

Ukraine on Black Sea Grain
Drone attacks in Ukraine
Ukraine's war with Russia
Russian President declares martial law

What is the reason for Putin's

What is the international community's response to Russian President Putin's decision to declare martial law?

decision to declare martial law?

What are Putin's goals in declaring martial law in four Ukrainian regions?

What implications does Putin's decision to declare martial law have for the people of the Donetsk and Luhansk regions?

Russia suspends grain deal 'dirty bomb' in Ukraine '

What are Putin's goals in declaring martial law in four Ukrainian regions?

### Summary

Vladimir Putin has declared martial law in four Ukrainian regions in order to gain control over the areas and suppress any resistance from the residents. He has also stated that this is necessary in order to protect Russia's security and future.

### Claims

Claim Sentence	Context
This new step means Putin can ban public gatherings and travel, set curfews, censor information and legally seize civilian resources in the regions of Donetsk, Kherson, Luhansk and Zaporizhzhia.Source	Russian President Vladimir Putin declared martial law in four annexed Ukrainian territories on October 19. This new step means Putin can ban public gatherings and travel, set curfews, censor information and legally seize civilian resources in the regions of Donetsk, Kherson, Luhansk and Zaporizhzhia. Max Bergmann at the Center for Strategic and International Studies explained that martial law is "the suspension of the rule of law.
"What itroflects to me is it seems his	Earlier on Wednesday, Putin announced martial law in the four Ukrainian regions he claims to have annexed: Kherson,

What are Putin's goals in declaring martial law in fo Ukrainian regions? Summary

Claims



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# Wait ... Can GPT-4 generate reports already?

Write a report about the situation of Ukraine Crisis between Oct 16 and Oct 30th.

Here is a report I wrote about the situation of Ukraine Crisis between Oct 16 and Oct 30th:

The Ukraine Crisis is a conflict between Ukraine and Russia that started in 2014 after a popular uprising ousted pro-Russian President Viktor Yanukovych and Russia annexed Crimea, a peninsula in southern Ukraine. The crisis has since escalated into a war in eastern Ukraine, where pro-Russian separatists, backed by Russian troops and weapons, have fought against the Ukrainian government forces for control of the region <sup>1</sup>.

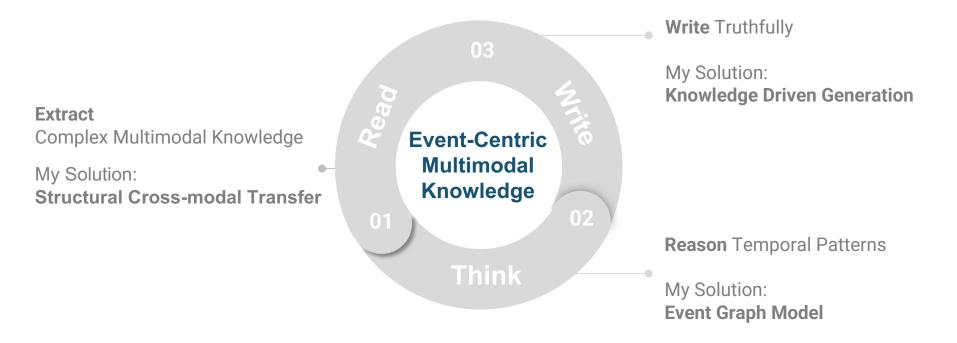
In October 2022, the situation in Ukraine deteriorated as Russia launched a new offensive against Ukraine, violating a ceasefire agreement that had been in place since 2015. According to NATO, Russia has amassed over 100,000 troops near the border with Ukraine and has been conducting airstrikes, missile attacks, and artillery shelling on Ukrainian positions and civilian areas <sup>2</sup>. Ukraine has responded with its own air and ground strikes, hitting Russian targets and repelling attacks. The resulted in hundreds of casualties, including civilians, and has displaced nearly 30° population, creating a humanitarian crisis <sup>3</sup>.

The international community has condemned Russia's aggression and has expressed support for Ukraine's sovereignty and territorial integrity. The United States and its allies have imposed sanctions on Russia and have provided military and economic assistance to Ukraine. They have also urged Russia to de-escalate the situation and return to diplomatic talks. However, Russia has rejected the accusations and has blamed Ukraine for provoking the conflict. Russia has also suspended its participation in the Black Sea grain initiative, a regional cooperation project that allowed food exports from Ukrainian ports 4

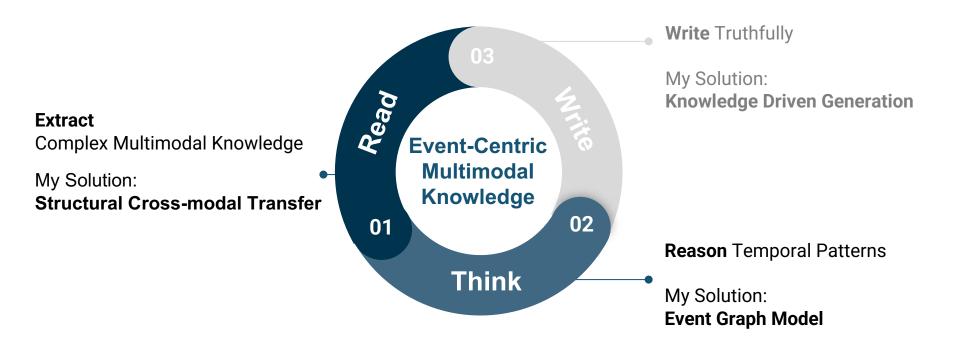
The Ukraine Crisis poses a serious threat to the regional and global security and stability, as well as to the human rights and dignity of the people affected by the violence. The crisis also challenges the principles of international law and order, and the role of multilateral institutions in resolving conflicts peacefully. The crisis requires urgent and sustained efforts from all parties involved to end the hostilities, respect the ceasefire, and engage in a constructive dialogue to find a political solution that respects the sovereignty and territorial integrity of Ukraine <sup>5</sup>.

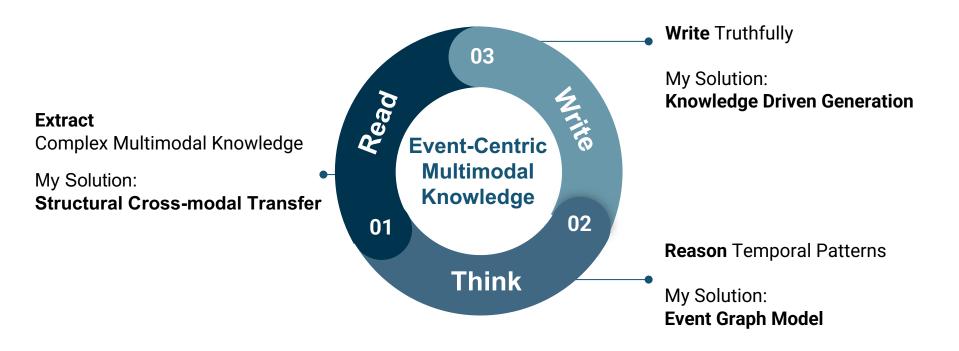
<sup>6</sup>: Latest Developments in Ukraine: Oct. 16 - voanews.com <sup>4</sup>: Latest Developments in Ukraine: Oct 30 - voanews.com <sup>7</sup>: Russia-Ukraine war, as it happened: nearly 9,000 Russian troops to be ... - theguardian.com <sup>8</sup>: WHO Ukraine Crisis Response (October 2022 Bulletin) - reliefweb.int <sup>5</sup>: Ukraine and the Contingency of Global Order - foreignaffairs.com <sup>3</sup>: The Ukraine crisis, explained: 6 things you should know - concernusa.org <sup>1</sup>: Ukraine crisis | Ukrainian history [2013-2014] | Britannica - britannica.com <sup>9</sup>: Everything you need to know about the 2014 Ukraine crisis - vox.com <sup>2</sup>: New Russian offensive underway in Ukraine, says NATO - reuters.com

- Fluent, but short, generic and boring
- No guarantee of truthful information
- Low coverage of salient events
- Not restricted to Oct 16 Oct 30
- No multiple views (biased)
- Sources: English text only









### New Research Direction:

Event-Centric Multimodal Knowledge Graph (next generation of information access)

## **New Research Hypothesis:**

- Multimodal Semantic Structures ← Structural Transfer from Text to Vision
- Long-Horizon Temporal Dynamics ← Event Graph Model as Pattern Knowledge

Knowledge for Truthful Generation: Timeline Summarization, etc.







Microsoft\* Research **IBM** Research

**DARPA** Riser

Invited Presentation at DARPA Forward Event Transition

10-year Milestone Demo Day (NS-CTA) Ranked 1st at TAC SM-KBP TA1 (led 19 students)

Microsoft PhD Fellowship

**US Patent** 

**EE CS Rising Star** 

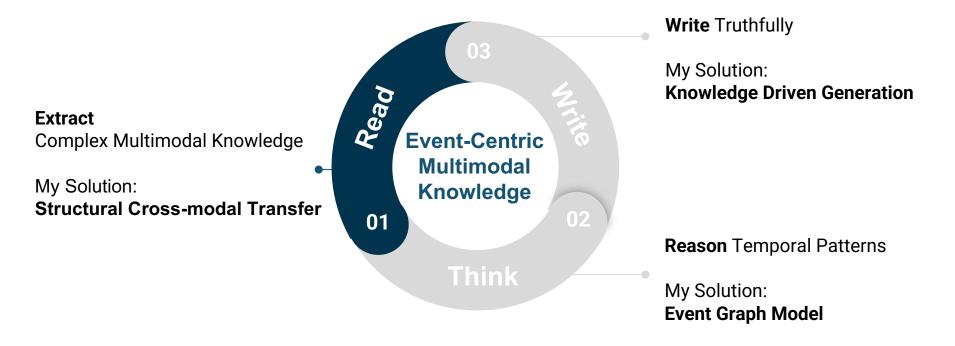


\*ACL ACL'20 Best Demo Paper



NAACL'21 Best Demo Paper

## **Research Overview**



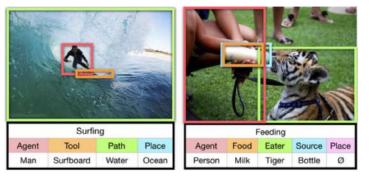




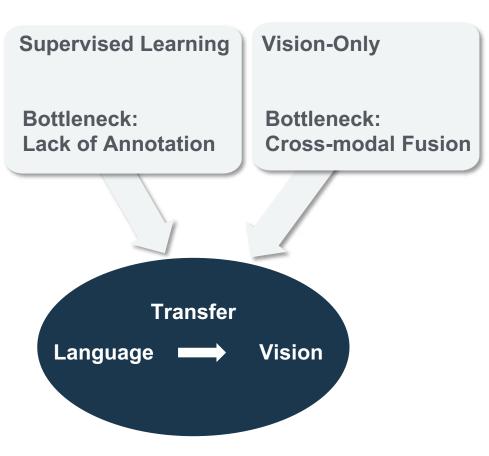
# **Bottlenecks of Vision Semantic Structure Learning**







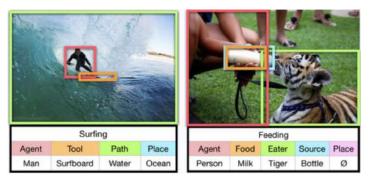
(Pratt et al., 2020, ...)



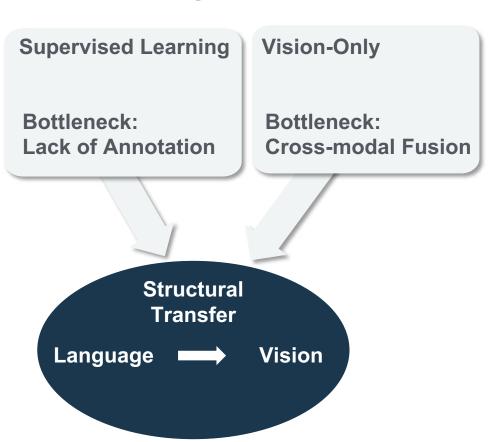
# **Bottlenecks of Vision Semantic Structure Learning**



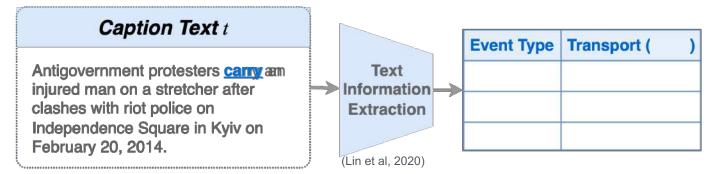
(Yatskar et al., 2016, ...)



(Pratt et al., 2020, ...)

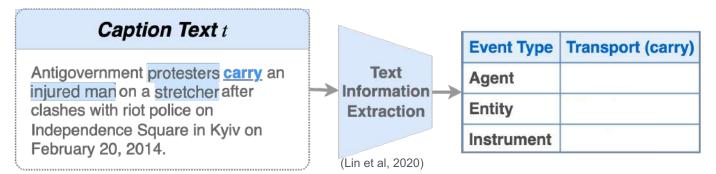


# CLIP-Event: Event-Driven Vision-Language Pretraining [CVPR'22]

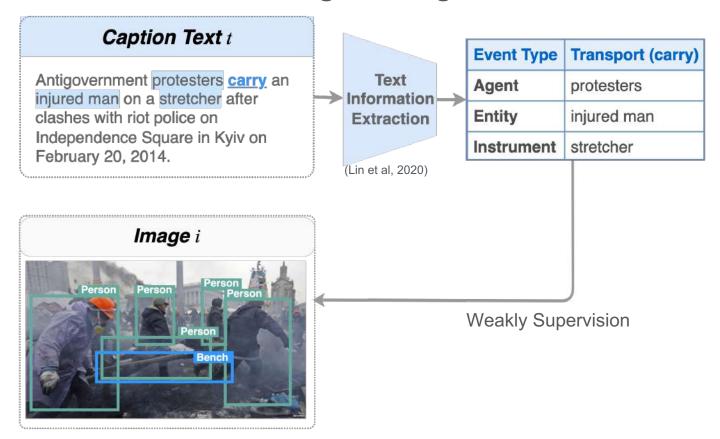


[Li, et al., CVPR 2022]

# **CLIP-Event: Event-Driven Vision-Language Pretraining [CVPR'22]**



# Transfer text event knowledge to images



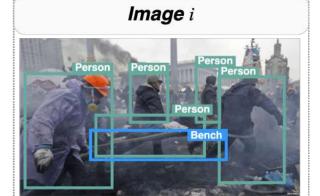
# Hard negatives via manipulating event structures

Antigovernment protesters carry a injured man on a stretcher after clashes with riot police on Independence Square in Kyiv on February 20, 2014.

## Positive Labels

<b>Event Type</b>	Transport (carry)
Agent	protesters
Entity	injured man
Instrument	stretcher

Confusion Matrix



## Negative Labels (events)

<b>Event Type</b>	Arrest (arrest)
Agent	protesters
Entity	injured man
Instrument	stretcher

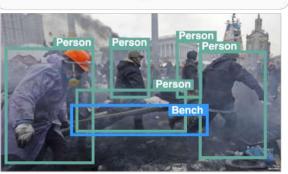
# Hard negatives via manipulating event structures

Antigovernment protesters carry a injured man on a stretcher after clashes with riot police on Independence Square in Kyiv on February 20, 2014.

# Positive Labels

	<b>Event Type</b>	Transport (carry)
	Agent	protesters
	Entity	injured man
	Instrument	stretcher

## **Image** i



Negative Labels (events)

Negative Labels (arguments)

<b>Event Type</b>	Arrest (arrest)
Agent	protesters
Entity	injured man
Instrument	stretcher

Event Type Transport (carry)
Agent protesters
Entity injured man
Instrument stretcher

Role Switching

# Hard negatives via manipulating event structures

government protesters carry an ed man on a stretcher after

Positive Labels

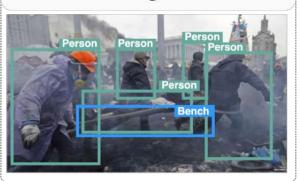
Event Type Transport (carry)
Agent protesters
Entity injured man
Instrument stretcher

Protesters transported injured man using a stretcher.

prompt

prompt

Image i



Negative Labels (events) Event Type Arrest (arrest)

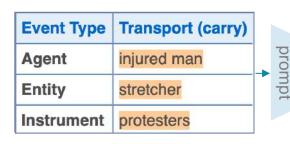
Agent protesters

Entity injured man

Instrument stretcher

Protesters
arrested
injured man
using a
stretcher.

Negative Labels (arguments)



Injured man transported a stretcher with protesters.

## Hard negatives via manipulating event structures

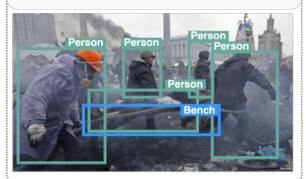
### Caption Text t

Antigovernment protesters <u>carry</u> a injured man on a stretcher after clashes with riot police on Independence Square in Kyiv on February 20, 2014.



Protesters transported injured man using a stretcher.





Negative Labels (events)

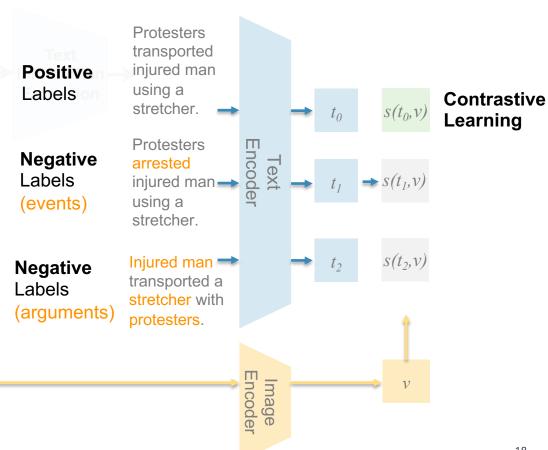
Protesters arrested injured man using a stretcher.

Negative Labels (arguments)

Injured man transported a stretcher with protesters.

# **Contrastive Learning on Event Semantics**

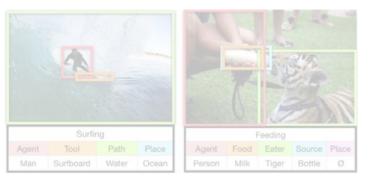
# **Image** i Person



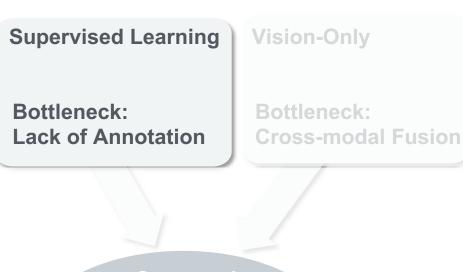
# **Bottlenecks of Vision Semantic Structure Learning**

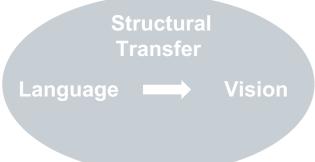


(Yatskar et al., 2016, ...)



(Pratt et al., 2020, ...)

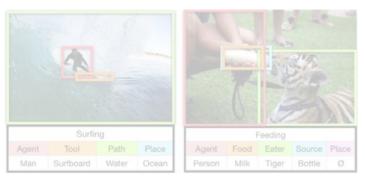




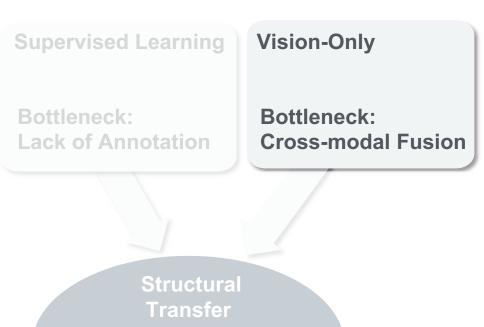
## **Bottlenecks of Vision Semantic Structure Learning**



(Yatskar et al., 2016, ...)



(Pratt et al., 2020, ...)



Language -

Vision

### **Challenge: Structured Encoding**

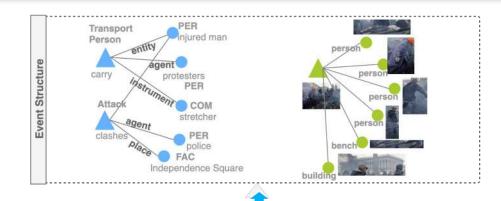
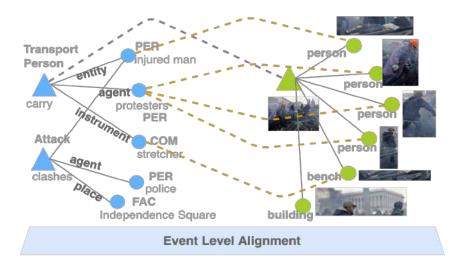


Image & Caption

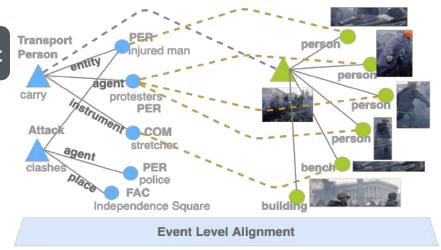
Antigovernment protesters carry an injured man on a stretcher after clashes with riot police on Independence Square in Kyiv on February 20, 2014.





### **Structured Alignment via Optimal Transport**

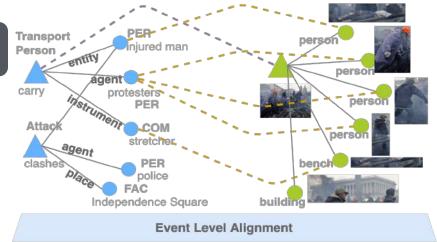
Text Event Graph Image Event Graph



### **Structured Alignment via Optimal Transport**

Text Event Graph Image Event Graph

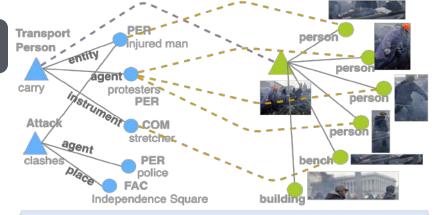
1 Define cost matrix *C* (embedding similarity)



### **Structured Alignment via Optimal Transport**

Text Event Graph Image Event Graph

- 1 Define cost matrix *C* (embedding similarity)
- Optimization Goal: minimize transport distance  $D(S,T) = \min_{T} T \cdot C$



#### **Event Level Alignment**

The optimal *T* is approximated by a differentiable Sinkhorn Knopp algorithm (Sinkhorn, 1964; Cuturi, 2013)

$$T = \operatorname{diag}(\boldsymbol{p}) \exp(-\boldsymbol{C}/\gamma) \operatorname{diag}(\boldsymbol{q})$$

for  $i = 0, 1, 2, \dots$  until convergence,

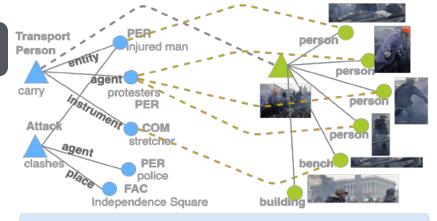
$$egin{aligned} oldsymbol{p}^{i+1} &= \mathbf{1} \oslash (oldsymbol{K}oldsymbol{q}^i), \ oldsymbol{q}^{i+1} &= \mathbf{1} \oslash (oldsymbol{K}^ op oldsymbol{p}^{i+1}), \end{aligned}$$

$$oldsymbol{T}^k := ext{diag}(oldsymbol{p}^k) oldsymbol{K} ext{diag}(oldsymbol{q}^k)$$

### **Structured Alignment via Optimal Transport**

Text Event Graph Image Event Graph

- 1 Define cost matrix *C* (embedding similarity)
- Optimization Goal: minimize transport distance  $D(S,T) = \min_{T} T \cdot C$
- Optimize the transport plan *T* within *k* iterations



#### **Event Level Alignment**

The optimal *T* is approximated by a differentiable Sinkhorn Knopp algorithm (Sinkhorn, 1964; Cuturi, 2013)

$$T = \operatorname{diag}(\boldsymbol{p}) \exp(-\boldsymbol{C}/\gamma) \operatorname{diag}(\boldsymbol{q})$$

for  $i = 0, 1, 2, \dots$  until convergence,

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$$m{T}^k := ext{diag}(m{p}^k) m{K} ext{diag}(m{q}^k)$$

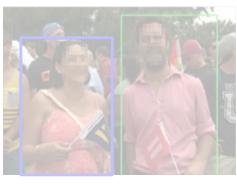
### **CLIP-Event on Visual Event Extraction**

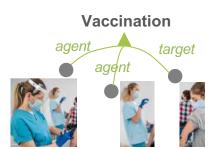
### Supporting Zero-shot Vision Event Extraction the first time.



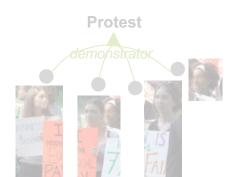














### **CLIP-Event on Visual Event Extraction**

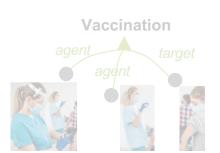
### Supporting Zero-shot Vision Event Extraction the first time.



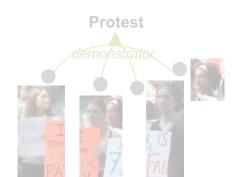














### **CLIP-Event on Visual Event Extraction**

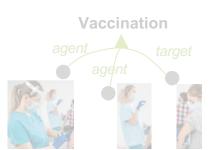
### Supporting Zero-shot Vision Event Extraction the first time.



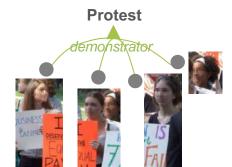


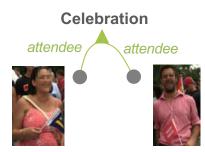












# Video Events as Argument State Changes [AAAI'23]









**Video Event** 

=

**Status Changes of Objects** 

# Video Events as Argument State Changes [AAAI'23]









**Video Event** 

**Status Changes of Objects** 

**Status Changes of an Object** 

-

**Displacement** 

+

**Pixel Changes** 

# Impact: Introducing Event Semantic Structures to V+L Pretraining

#### **Ambiguous Images With Human Judgments for Robust Visual Event Classification**

Angi Liu Benjamin Van Durme Johns Hopkins University

Human Language Technology Center of Excellence {ksande25, rkriz1, aliu74, vandurme}@jhu.edu

#### Multimedia Event Extraction From News With a Unified Contrastive Learning Framework

Beijing Key Lab of Traffic Data Analysis and Mining. Beijing Jiaotong University Beijing, China iianliu@bitu.edu.cn

Yufeng Chen Beijing Key Lab of Traffic Data Analysis and Mining, Beijing Jiaotong University Beijing, China chenyf@bjtu.edu.cn

Beijing Key Lab of Traffic Data Analysis and Mining, Beijing Jiaotong University Beijing, China iaxu@bitu.edu.cn

#### Visual Semantic Role Labeling for Video Understanding

Aniruddha Kembhavi3 Tanmay Gupta<sup>8</sup> Ram Nevatia1 <sup>1</sup>University of Southern California <sup>2</sup>University of Pennsylvania 3PRIOR @ Allen Institute for AI {asadhu|nevatia}@usc.edu myatskar@seas.upenn.edu {tanmayg[anik]@allenai.org

#### Deep Multi-Modal Structural Equations For Causal Effect Estimation With Unstructured Proxies

Shachi Deshpande<sup>1,2</sup>, Kaiwen Wang<sup>1,2</sup>, Dhruy Sreeniyas<sup>2</sup>, Zheng Li<sup>1,2</sup>, Volodymyr Kuleshoy<sup>1,1</sup> Department of Computer Science, Cornell Tech1 and Cornell University {ssd86, kw437, ds844, z1634, kuleshov}@cornell.edu

#### Video Ouestion Answering with Phrases via Semantic Roles

Arka Sadhu<sup>1</sup> Kan Chen<sup>2</sup> Ram Nevatia1 <sup>1</sup>University of Southern California <sup>2</sup>Facebook Inc. (asadhu|nevatia)@usc.edu kanchen18@fb.com

Multimodal Semantic **Structure** Follow-ups from Others Language as Supervision

#### Zero-Shot Video Question Answering via Frozen Bidirectional Language Models

Antoine Yang<sup>1,2</sup>, Antoine Miech<sup>3</sup>, Josef Sivic<sup>4</sup>, Ivan Laptev<sup>1,2</sup>, Cordelia Schmid<sup>1,2</sup> <sup>1</sup>Inria Paris <sup>2</sup>Département d'informatique de l'ENS, CNRS, PSL Research University 3DeepMind 4CIIRC CTU Prague

https://antoyang.github.io/frozenbilm.html

#### PromptCap: Prompt-Guided Task-Aware Image Captioning

Yushi Hu<sup>♠</sup>\* Hang Hua<sup>♦</sup>\* Zhengyuan Yang<sup>♥</sup> Weijia Shi<sup>♠</sup> Noah A. Smith<sup>♠†</sup> Jiebo Luo<sup>◊</sup> ◆University of Washington ◇University of Rochester <sup>♥</sup>Microsoft Corporation <sup>†</sup>Allen Institute for Artificial Intelligence

{yushihu,swj0419,nasmith}@washington.edu {hhua2, jluo}@cs.rochester.edu zhengyang@microsoft.com

#### Text2Mol: Cross-Modal Molecule Retrieval with Natural Language **Oueries**

Carl Edwards, ChengXiang Zhai, Heng Ji University of Illinois Urbana-Champaign (cne2, czhai, hengii @illinois.edu

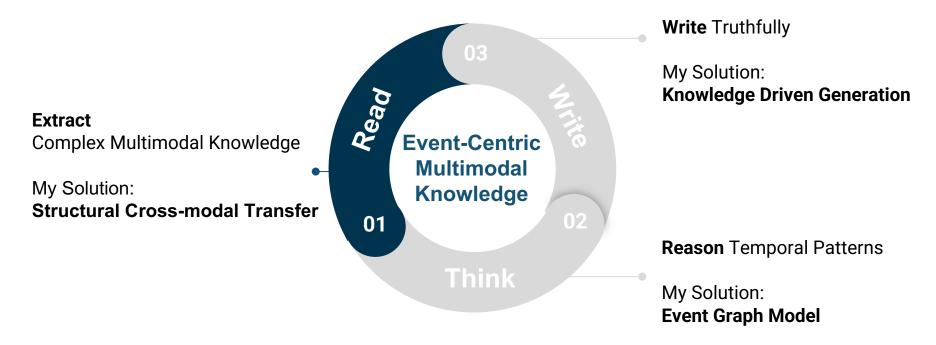
#### VOLTA: VISION-LANGUAGE TRANSFORMER WITH WEAKLY-SUPERVISED LOCAL-FEATURE ALIGNMENT

. . .

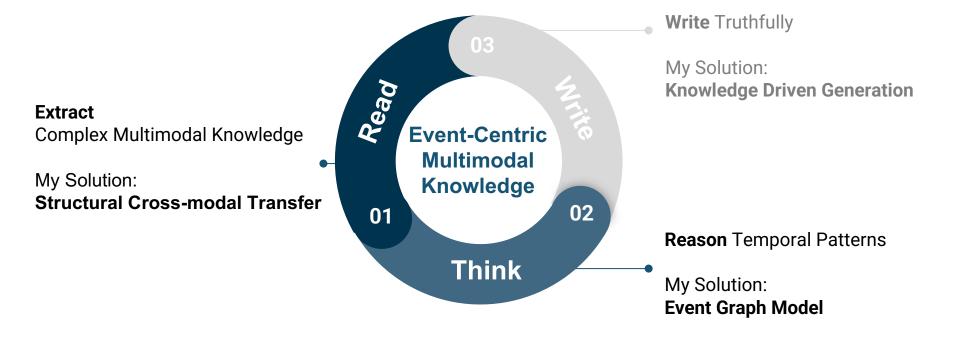
Shraman Pramanick\*1, Li Jing\*2, Sayan Nag\*3, Jiachen Zhu4, Hardik Shah2, Yann LeCun<sup>2,4</sup>, Rama Chellappa

<sup>1</sup>Johns Hopkins University <sup>2</sup>Meta AI <sup>3</sup>University of Toronto <sup>4</sup>New York University {spraman3, rchella4}@jhu.edu, {ljng, hjshah}@fb.com sayan.nag@mail.utoronto.ca, { jiachen.zhu, yann.lecun}@nyu.edu

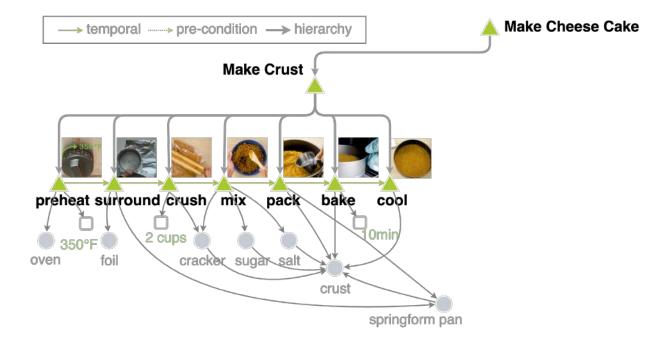
# **Quick Questions?**



# **Challenge 2: Long-Horizon Temporal Dynamics**

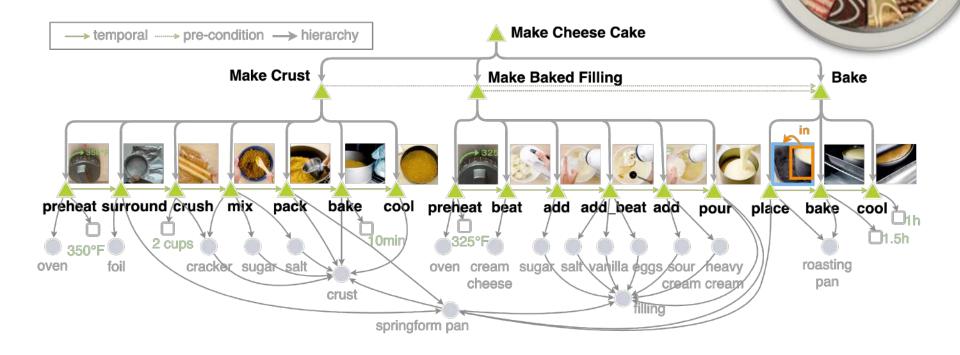


# **Procedure repeats itself**

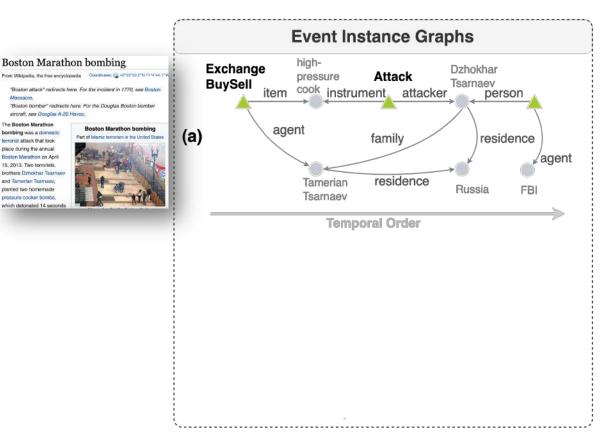




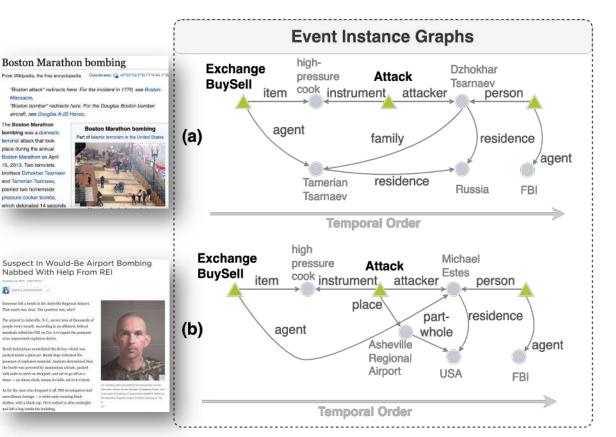
# **Procedure repeats itself**



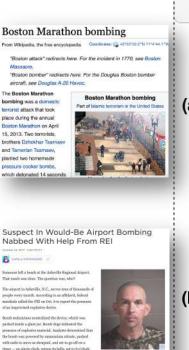
# **History repeats itself**



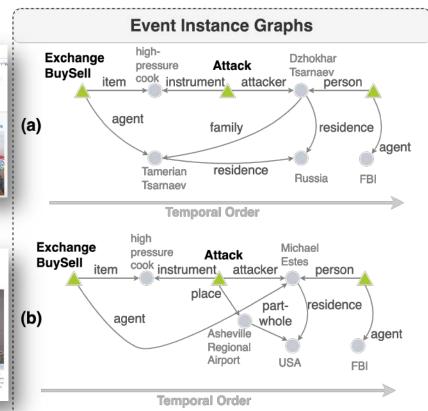
# **History repeats itself**

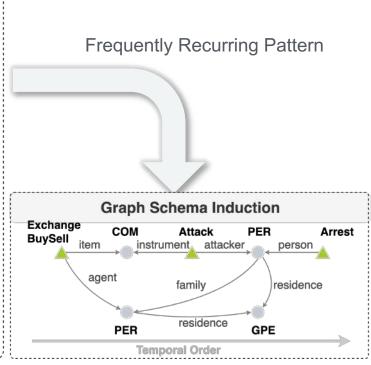


# **History repeats itself**



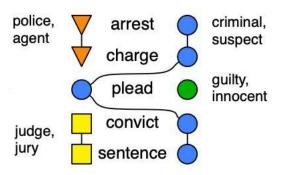
dottes, with a black cap. He'd walked in after midnight



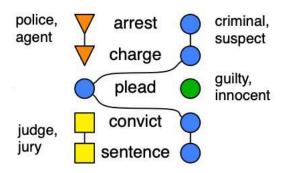


### What is Schema Induction?

**Schemas**, or **scripts**, were originally defined by (Schank and Abelson, 1975) as "a predetermined, stereotyped sequence of actions that defines a well-known situation".

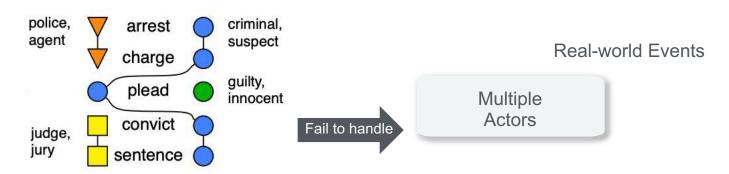


**Schemas**, or **scripts**, were originally defined by (Schank and Abelson, 1975) as "a predetermined, stereotyped sequence of actions that defines a well-known situation".



**Event Language Model?** 

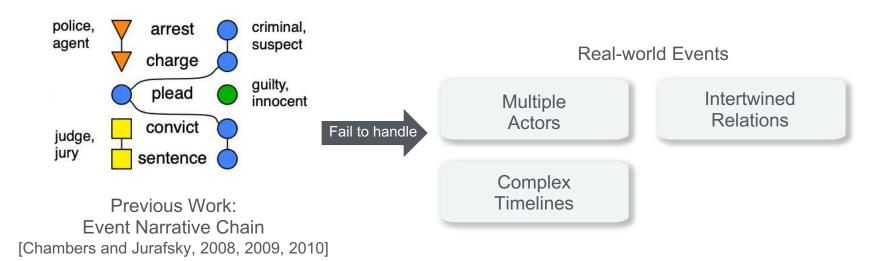
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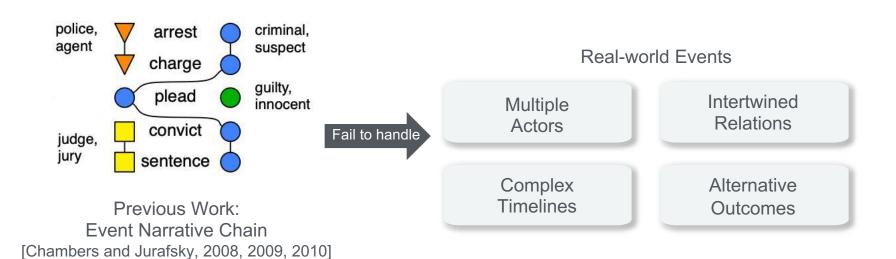
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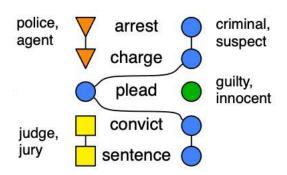


**Schemas**, or **scripts**, were originally defined by (Schank and Abelson, 1975) as "a predetermined, stereotyped sequence of actions that defines a well-known situation".



## My Solution: Event Graph Models as Schemas

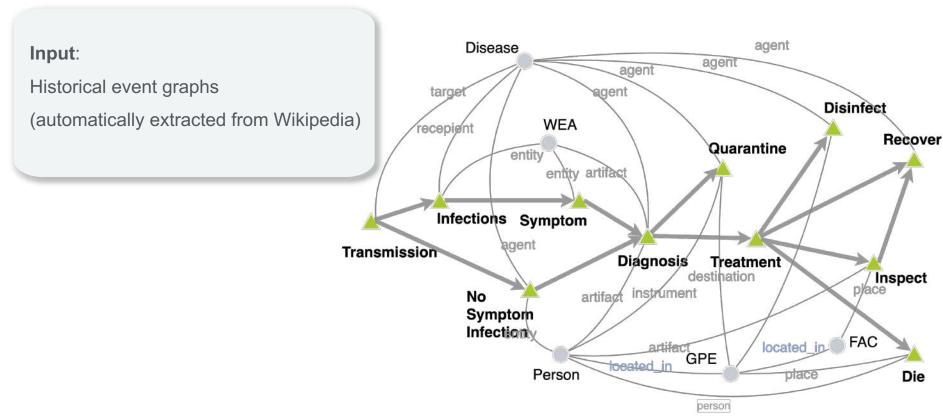
**Schemas**, or **scripts**, were originally defined by (Schank and Abelson, 1975) as "a predetermined, stereotyped sequence of actions that defines a well-known situation".



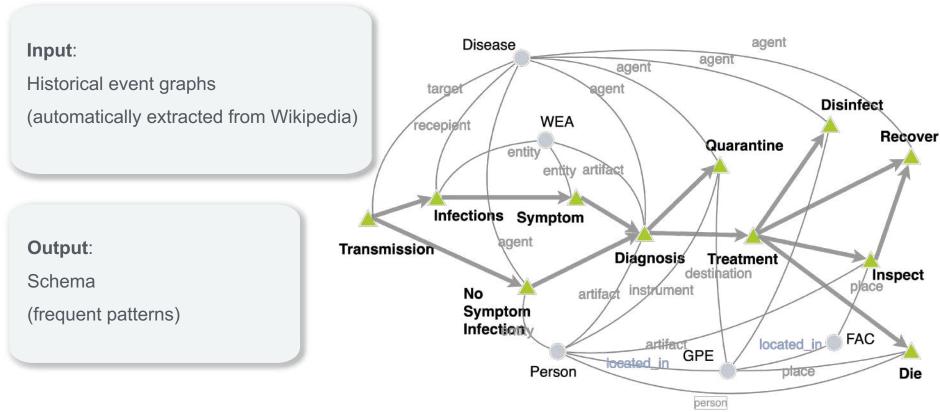


**Event Graph Model** 

## A new paradigm: Models as Schemas

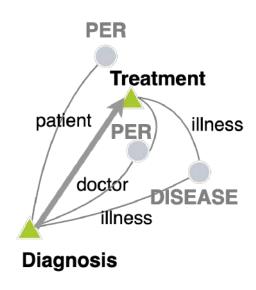


# A new paradigm: Models as Schemas



Schemas are the hidden knowledge to control instance graph generation

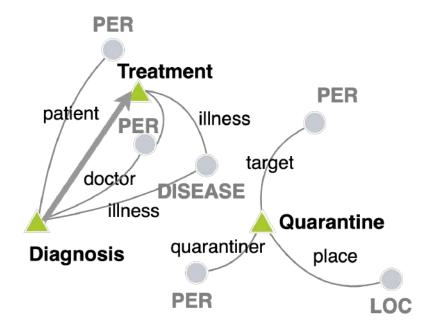
$$p(G) = \prod_{i=0}^{|\mathcal{E}|} p(G_i|G_{< i}).$$



Schemas are the hidden knowledge to control instance graph generation

$$p(G) = \prod_{i=0}^{|\mathcal{E}|} p(G_i|G_{< i}).$$

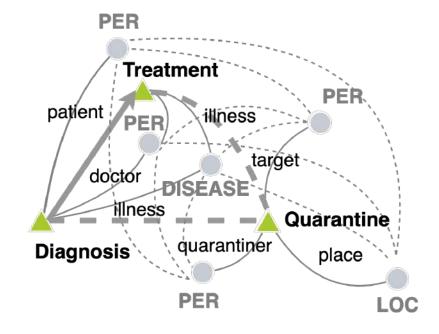
1 Event Node Generation



Schemas are the hidden knowledge to control instance graph generation

$$p(G) = \prod_{i=0}^{|\mathcal{E}|} p(G_i|G_{< i}).$$

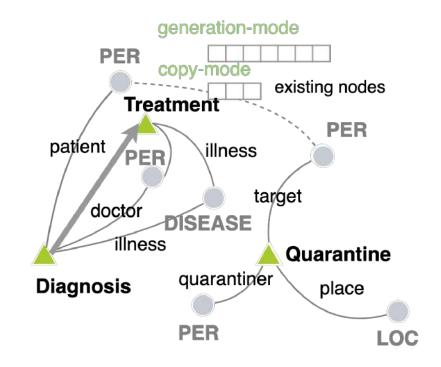
- 1 Event Node Generation
- 2 Message Passing



Schemas are the hidden knowledge to control instance graph generation

$$p(G) = \prod_{i=0}^{|\mathcal{E}|} p(G_i|G_{< i}).$$

- 1 Event Node Generation
- 2 Message Passing
- 3 Argument Node Generation

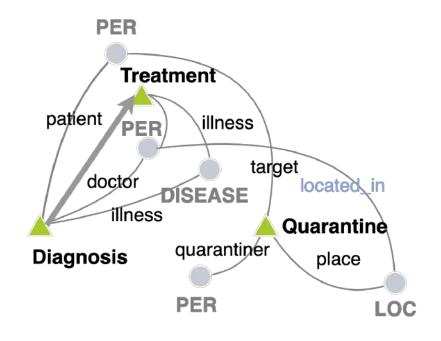


# **Event Graph Generative Model**

Schemas are the hidden knowledge to control instance graph generation

$$p(G) = \prod_{i=0}^{|\mathcal{E}|} p(G_i|G_{< i}).$$

- 1 Event Node Generation
- 2 Message Passing
- 3 Argument Node Generation
- 4 Relation Edge Generation

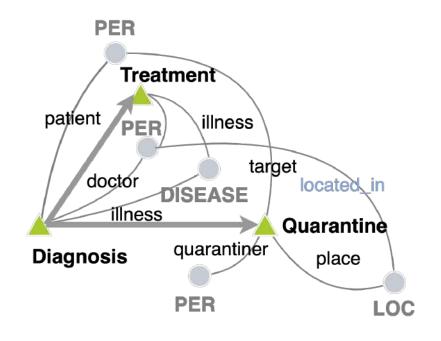


## **Event Graph Generative Model**

Schemas are the hidden knowledge to control instance graph generation

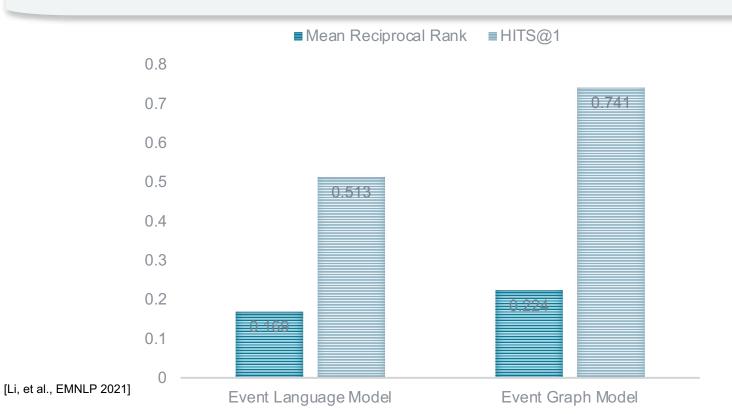
$$p(G) = \prod_{i=0}^{|\mathcal{E}|} p(G_i|G_{< i}).$$

- 1 Event Node Generation
- 2 Message Passing
- 3 Argument Node Generation
- 4 Relation Edge Generation
- 5 Temporal Edge Generation



## **Evaluation: Event Prediction triples human schema**

Schema-guided Event Prediction: The task aims to predict ending events.



## **Impact: Open doors to Event Graph Context**

Corpus-based Event Induction (Shen et al., 2021)

EcoNet (Han et al., 2020)

Prototype Learning (Deng et al., 2022)

Graph Autoencoder (Jin et al., 2022)



Event Graph

Models as
Schemas

Visual Goal-Step Pred (Yang et al., 2022)

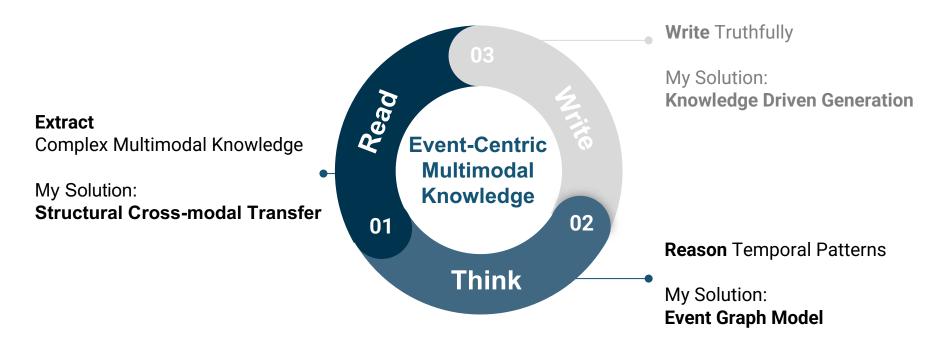
Goal-oriented script construction (Lyu et al., 2021)

Salience-aware event chain (Zhang et al., 2021)

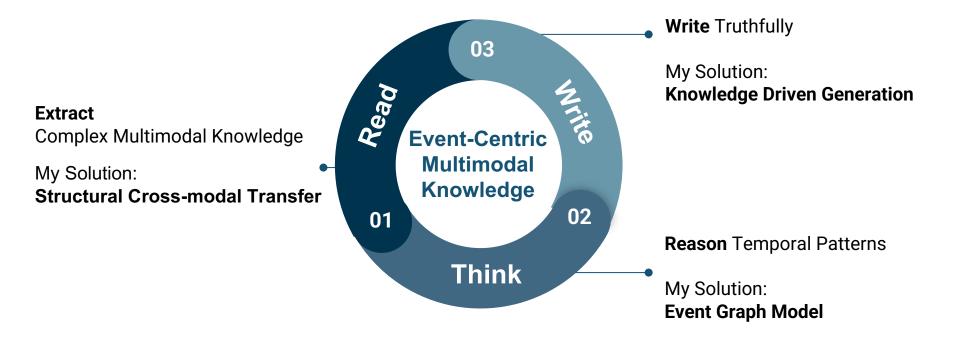
Association Rules in big graphs (Fan et al., 2022)

- - -

# **Quick Questions?**



## **Research Direction 3**



## Timeline Summarization: Extreme Long Context [EMNLP'21]

Goal: Summarize hundreds or thousands of input documents into a timeline.

## Input Documents

#### 2009-06-27

There was no sign of foul play in the death of Michael Jackson.....A recording of the telephone call made to emergency services has been released . in which the caller said Jackson was unconscious and had stopped breathing.

Born: August 29, 1958, Gary, Indiana, US. 'Also known as : The King of Pop .....

2009-06-27

Police also want to speak to Jackson's doctor who witnessed his collapse ....

On Friday night thousands of fans came together in London's Trafalgar Square to light candles and sing some of his biggest hits 2009-06-28

She said Dr Murray had traveled in ambulance with Jackson after he collapsed last Thursday ...

Dr Murray had been hired by Jackson in May to accompany him as he prepared to embark on a gruelling series of 50 concerts in London in July .

2009-06-28

Jackson family left speechless and devastated by star's death. Los Angeles police investigating the death of Michael Jackson say they have carried out an extensive interview with his doctor. Conrad Murray . ....

### 2009-06-28

Jackson's body was released to the family on Friday night. A spokeswoman for Dr Murray said he had been interviewed for three hours by police on Saturday .... He owes it to the family and to the public to say: 'These were the last hours of Michael's life and here's what happened' . " 2009-06-29

Paramedics were called to Jackson's Los Angeles mansion while Dr Murray was performing CPR, according to a recording of the 911 call. 2009-07-22

The Houston clinic of Michael Jackson 's doctor has been searched by drug police looking for evidence of manslaughter ....

Dr Murray 's spokeswoman told the BBC the raid was a surprise to us and it was a surprise to the attorneys.

### 2009-07-28

Police raid Jackson doctor 's home .....

### 2009-07-30

Jackson died at his Los Angeles home on 25 June aged 50 . ....

## **Output Timeline**

### 2009-06-25

Dr Murray finds Jackson unconscious in the bedroom of his Los Angeles mansion. Paramedics are called to the house while Dr Murray is performing CPR, according to a recording of the 911 emergency call. He travels with the singer in an ambulance to UCLA medical center where Jackson later dies

### 2009-06-28

Los Angeles police interview Dr Murray for three hours. His spokeswoman insists he is not a suspect".

### 2009-07-22

The doctor 's clinic in Houston is raided by officers from the Drug Enforcement Agency -LRB- DEA -RRB- looking for evidence of manslaughter.

39 [Li, et al., EMNLP 2021]

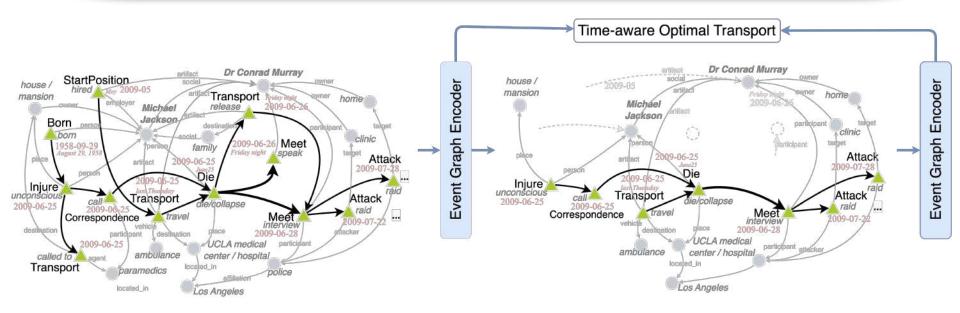
Event Graph Construction

Compression

Graph

# **Event Graph Compression with Optimal Transport (OT)**

**Optimization Goal:** minimize the distance between summary graph and original graph **Constraint:** Only select k% (e.g. 5%) nodes to summary graph.



## **Example Results on Timeline Summarization**

Event Graph demonstrate strong power in improving event facts coverage.

### 2011-02-15

Protests began February 15 in the eastern city of Benghazi , Libya 's second largest . Witness says square in Benghazi is full of protesters , but there is little sign of police or military Tanks surrounded demonstrators in Benghazi , a protester says 50 reportedly killed since Tuesday , 20 of them Friday U.S. president condemns the government crackdowns in Libya , Bahrain and Yemen (CNN) – At least 20 people were killed and 200 more were injured Friday in the northern Mediterranean city of Benghazi , Libya 's second-largest , said a medical source in Benghazi who was not identified for security reasons .

### 2011-02-21

Among other things, Washington was taking a close look at a speech early Monday by Saif al-Islam Gadhafi – the Libyan leader 's son – which included warnings of a civil war if demonstrations in the North African country do n't stop. The United States on Monday condemned the violence in Libya and called for a halt to the "unacceptable bloodshed" in response to civil unrest, Secretary of State Hillary Clinton said in a statement.

## Baseline

### 2011-02-16

Source: Several people arrested after police confronted protesters in Benghazi, Libya. 2011-02-18

An Iranian opposition member warns that street protests could lead to civil war "Nastaran "warns that protests are strengthening Iran's Revolutionary Guard and pro - government militia.

### 2011-02-19

A Libyan woman supportive of the protesters, who was not identified to protect her safety, told CNN that army soldiers on Saturday initially claimed solidarity with the demonstrators, only to reverse their tack and open fire on the crowd.

Three of those injured are in critical condition, the sources said.

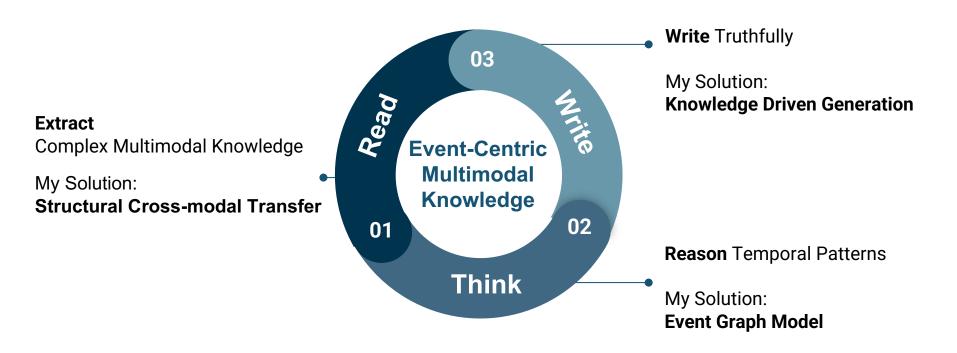
While Human Rights Watch , citing interviews with hospital staff and witnesses , reported 84  $\frac{deaths}{deaths}$  since Tuesday , the total number is unknown and could n 't be independently confirmed by CNN .

### 2011-02-20

Protests continue to turn violent, however the death and injury toll is unclear.

Ours

## **Research Contributions**



## **Research Contributions**

## **New Research Direction:**

Event-Centric Multimodal Knowledge (next generation of information access)

## **New Research Hypothesis:**

- Complex Multimodal Knowledge ← Cross-modal Structural Transfer
- Long-horizon Temporal Dynamics ← Event Graph Schema Model

Knowledge for Truthful Generation: Timeline Summarization, ...

## Received broad attention in the community

## What is Event Knowledge Graph: A Survey

Saiping Guan, Xueqi Cheng, Long Bai, Fujun Zhang, Zixuan Li, Yutao Zeng, Xiaolong Jin, and Jiafeng Guo

Abstract—Besides entity-centric knowledge, usually organized as Knowledge Graph (KG), events are also an essential kind of knowledge in the world, which trigger the spring up of event-centric knowledge representation form like Event KG (EKG). It plays an increasingly important role in many downstream applications, such as search, question-answering, recommendation, financial quantitative investments, and text generation. This paper provides a comprehensive survey of EKG from history, ontology, instance, and application views. Specifically, to characterize EKG thoroughly, we focus on its history, definition, schema induction, acquisition, related representative graphs/systems, and applications. The development processes and trends are studied therein. We further summarize prospective directions to facilitate future research on EKG.

Index Terms—Event knowledge graph, schema, event acquisition, script event prediction, temporal knowledge graph prediction.

# Multi-Modal Knowledge Graph Construction and Application: A Survey

Xiangru Zhu, Zhixu Li *Member, IEEE*, Xiaodan Wang, Xueyao Jiang, Penglei Sun, Xuwu Wang, Yanghua Xiao *Member, IEEE*, Nicholas Jing Yuan *Member, IEEE*,

Abstract—Recent years have witnessed the resurgence of knowledge engineering which is featured by the fast growth of knowledge graphs. However, most of existing knowledge graphs are represented with pure symbols, which hurts the machine's capability to understand the real world. The multi-modalization of knowledge graphs is an inevitable key step towards the realization of human-level machine intelligence. The results of this endeavor are Multi-modal Knowledge Graphs (MMKGs). In this survey on MMKGs constructed by texts and images, we first give definitions of MMKGs, followed with the preliminaries on multi-modal tasks and techniques. We then systematically review the challenges, progresses and opportunities on the construction and application of MMKGs respectively, with detailed analyses of the strengths and weaknesses of different solutions. We finalize this survey with open research problems relevant to MMKGs.

## **Research Contributions**

## **New Research Direction:**

Event-Centric Multimodal Knowledge (next generation of information access)

## **New Research Hypothesis:**

- Complex Multimodal Knowledge ← Cross-modal Structural Transfer
- Long-horizon Temporal Dynamics ← Event Graph Schema Model

**Extract: Complex Multimodal Knowledge** 

Knowledge for Truthful Generation: Timeline Summarization, ...







Microsoft\* Research IBM Research

**DARPA** Riser

Invited Presentation at DARPA Forward Event Transition

10-year Milestone Demo Day (NS-CTA) Ranked 1st at TAC SM-KBP TA1 (led 19 students)

Microsoft PhD Fellowship

**US Patent** 

**EE CS Rising Star** 



\*ACL ACL'20 Best Demo Paper



**NAACL'21 Best Demo Paper** 

# Open-source Multimodal Information Extraction System [Manling Li, et al., ACL 2020 Best Demo Paper; led 19 students to develop it]

GAIA at SM-KBP 2020 - A Dockerlized Multi-media Multi-lingual Knowledge Extraction, Clustering, Temporal Tracking and Hypothesis **Generation System** 

Manling Li<sup>1</sup>, Ying Lin<sup>1</sup>, Tuan Manh Lai<sup>1</sup>, Xiaoman Pan<sup>1</sup>, Haoyang Wen<sup>1</sup>, Sha Li<sup>1</sup> Zhenhailong Wang<sup>1</sup>, Pengfei Yu<sup>1</sup>, Lifu Huang<sup>1</sup>, Di Lu<sup>1</sup>, Qingyun Wang<sup>1</sup> Haoran Zhang<sup>1</sup>, Qi Zeng<sup>1</sup>, Chi Han<sup>1</sup>, Zixuan Zhang<sup>1</sup>, Yujia Qin<sup>1</sup> Xiaodan Hu<sup>1</sup>, Nikolaus Parulian<sup>1</sup>, Daniel Campos<sup>1</sup>, Heng Ji<sup>1</sup> <sup>1</sup> University of Illinois at Urbana-Champaign hengji@illinois.edu

Brian Chen<sup>2</sup>, Xudong Lin<sup>2</sup>, Alireza Zareian<sup>2</sup>, Amith Ananthram<sup>2</sup>, Emily Allaway<sup>2</sup> Shih-Fu Chang<sup>2</sup>, Kathleen McKeown<sup>2</sup>

<sup>2</sup> Columbia University sc250@columbia.edu, kathy@cs.columbia.edu

Yixiang Yao<sup>3</sup>, Michael Spector<sup>3</sup>, Mitchell DeHaven<sup>3</sup>, Daniel Napierski<sup>3</sup>, Marjorie Freedman<sup>3</sup>, Pedro Szekely<sup>3</sup>

<sup>3</sup> Information Sciences Institute, University of Southern California mrf@isi.edu Haidong Zhu<sup>4</sup>, Ram Nevatia<sup>4</sup>

<sup>4</sup>University of Southern California nevatia@usc.edu Yang Bai<sup>5</sup>, Yifan Wang<sup>5</sup>, Ali Sadeghian<sup>5</sup>, Haodi Ma<sup>5</sup>, Daisy Zhe Wang<sup>5</sup> <sup>5</sup> University of Florida daisyw@ufl.edu





- ARL Demo Day
- AFRL Transition A



DARPA Demo Day



- DARPA Riser in 2022
- Ranked 1st at TAC SM-KBP 2019 and 2020 Evaluation (10% higher than the second ranked team in 2019)
  - Publicly Available at http://blender.cs.illinois.e du/software/gaia-ie

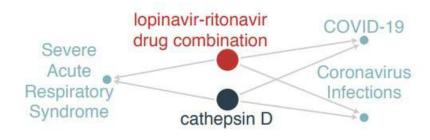








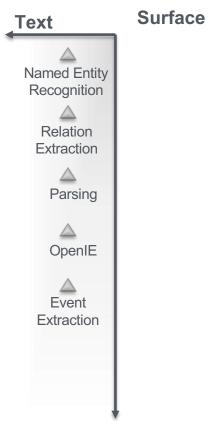
# **COVID-19 Literature Knowledge Graph Construction** [Qingyun Wang, Manling Li, et al., NAACL 2021 Best Demo Paper]



Question	Example Answers	
Q1	Drug Class	angiotensin-converting enzyme (ACE) inhibitors
	Disease	hypertension
	Evidence Sentences	[PMID:32314699 (PMC7253125)] Past medical history was significant for hypertension, treated with amlodipine and benazepril, and chronic back pain.
		[PMID:32081428 (PMC7092824)] On the other hand, many ACE inhibitors are currently used to treat hypertension and other cardiovascular diseases. Among them are captopril, perindopril, ramipril, lisinopril, benazepril, and moexipril.

- Help with drug re-purposing report generation during collaborations with Prof David Liem from UCLA Data Science in Cardiovascular Medicine.
- Widely used by other researchers, the KB has downloaded more than 2000 times.

Publicly Available at <a href="https://blender.cs.illinois.edu/covid19/">https://blender.cs.illinois.edu/covid19/</a>

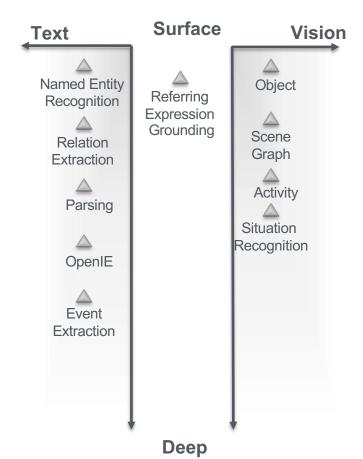


**Why Event-Centric?** 

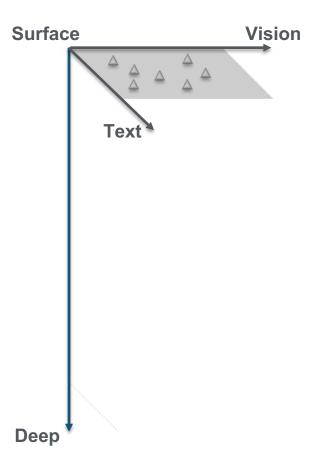
Deep

**Write: Truthfully** 

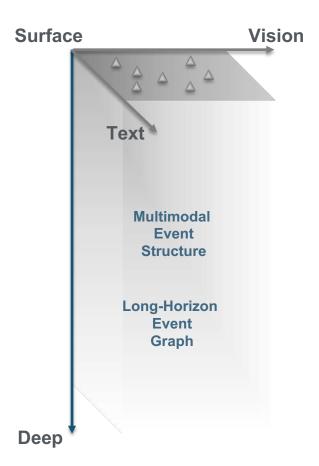
Future Work

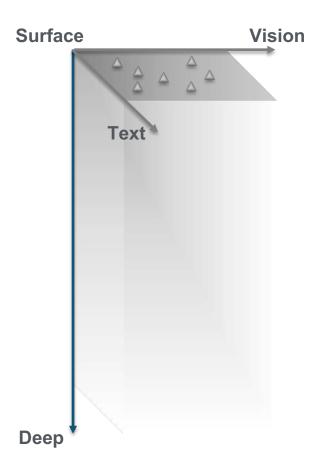


**Why Event-Centric?** 



Why Event-Centric?

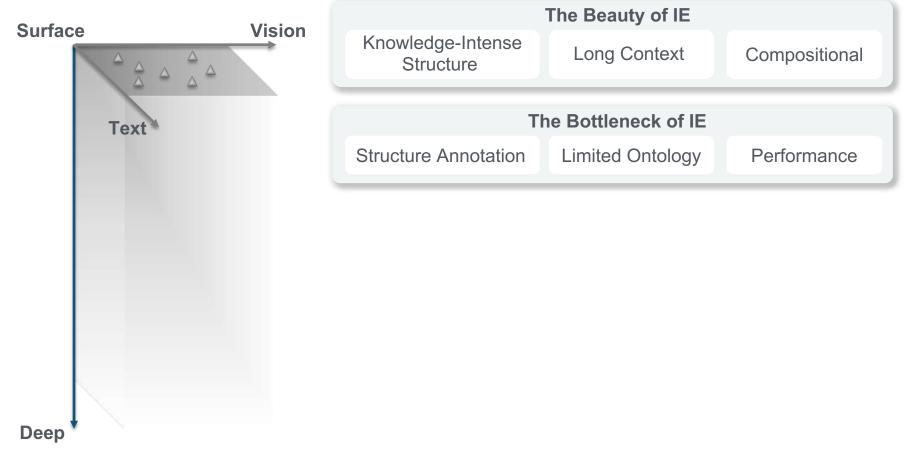


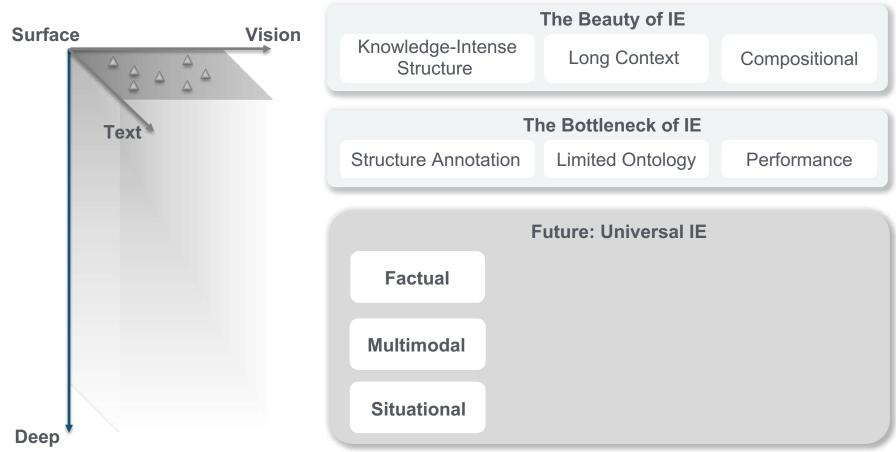


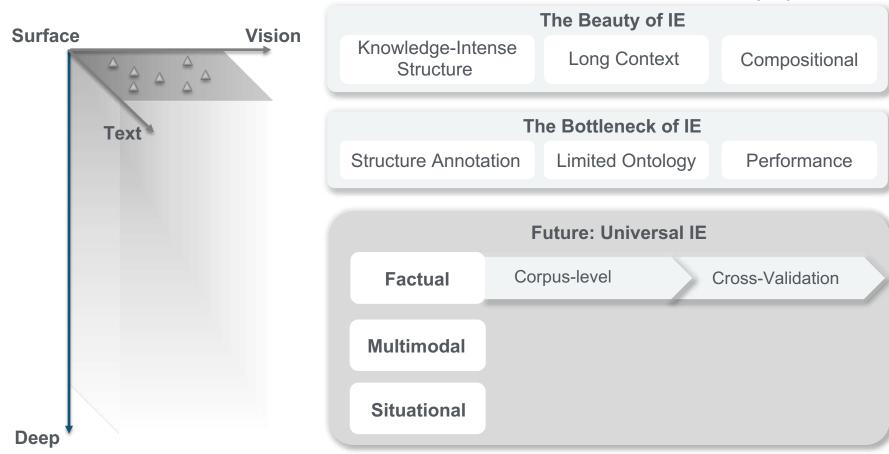
The Beauty of IE

Knowledge-Intense Structure Long Context

Compositional

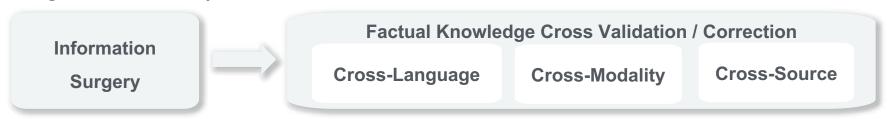


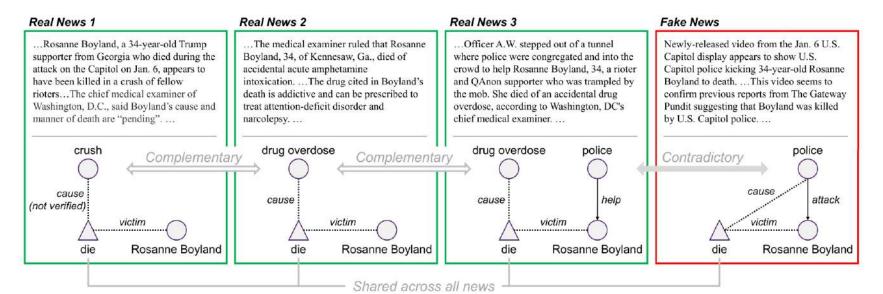


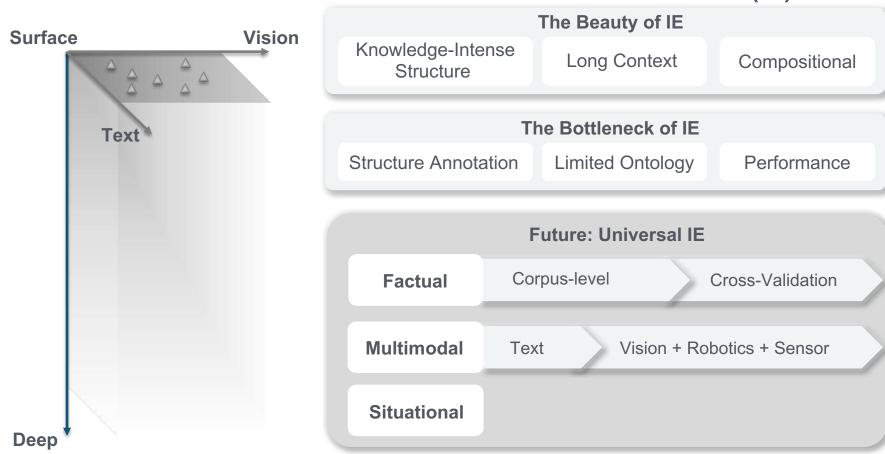


# **Future Research 1 Factuality, Evidence and Truth in Information Access**

Potential Collaborations: Prof Kris Hammond, Prof Ken Forbus, Prof Samir Khuller, Prof Han Liu, Prof Haoqi Zhang, Prof Matthew Kay, Prof Lawrence Birnbaum, et al

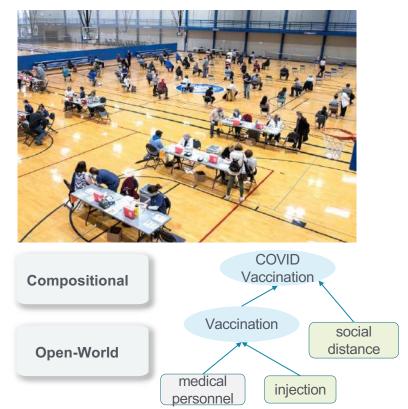


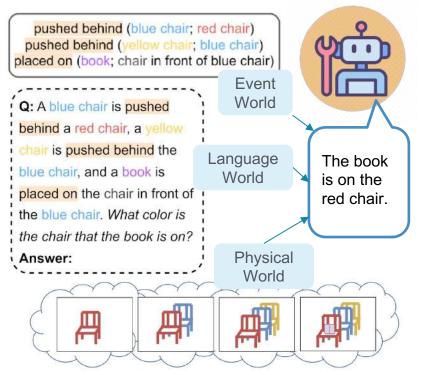




# Future Research 2: Modeling the semantics of vision world and physical world

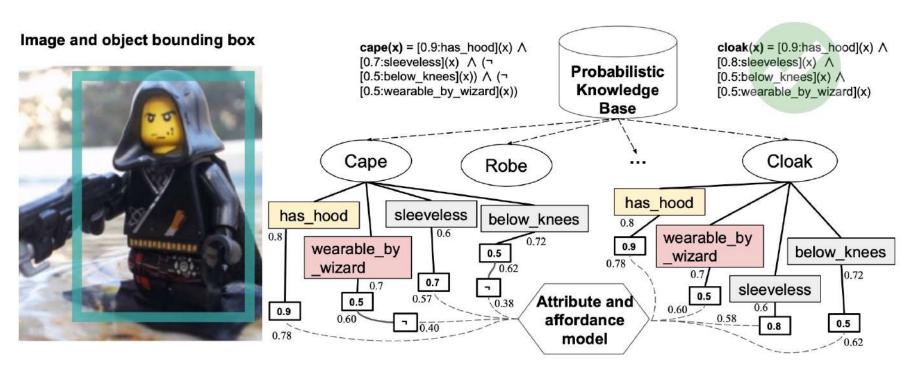
Potential Collaborations: Prof Ken Forbus, Prof Mike Rubenstein, Prof Brenna Argall, Prof Larry Birnbaum, Prof Emma Alexander, Prof Michael S. Horn, Prof Lawrence Birnbaum, et al

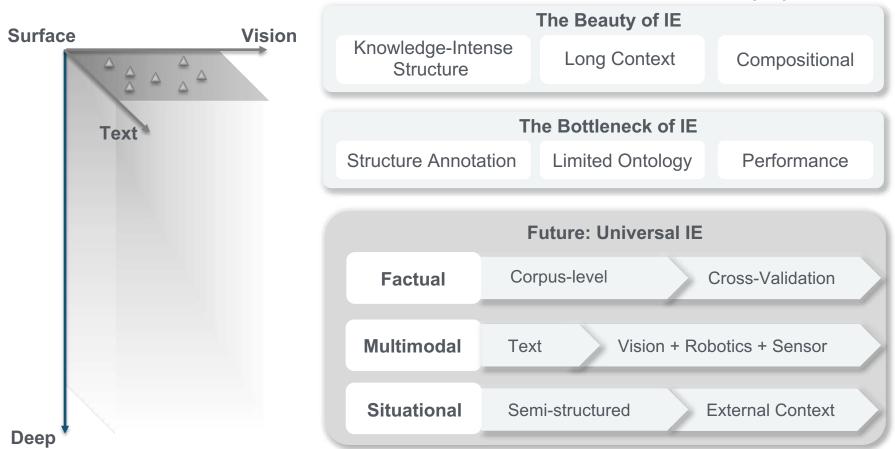




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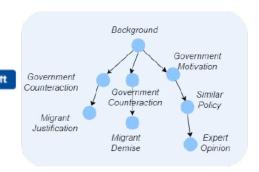


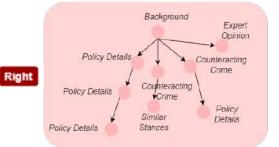
# Future Research 3 Explainable Knowledge Reasoning via Semi-Structured Graph

Potential Collaborations: Prof Ken Forbus, Prof Kris Hammond, Prof Chris Riesbeck, Prof Jessica Hullman, Prof Han Liu, Prof Samir Khuller, Prof Brent J. Hecht, Prof Aravindan Vijayaraghavan, Prof Matthew Kay, et al

## Social/Propaganda Knowledge

UK and France sign \$74 mln agreement to tackle illegal migration

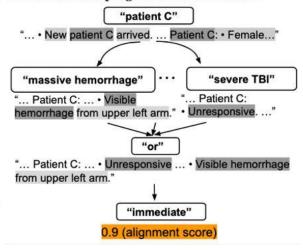




## **Healthcare Knowledge**

- <u>Category</u> which requires immediate actions includes patients with any MARCH issues, airway obstruction, fail/open chest wound, tension-pneumothorax/hemothorax, massive hemorrhage, 20-70% burns, unstable Vital Signs, or severe TBI (unconscious alive Pt).
- Category II which can be delayed includes patients with open fractures w/PMS intact, soft tissue injuries, moderate TBI (stable vital signs) or open abdominal wounds.
- <u>Category III</u> which requires minimal actions includes patients with minor abrasions, burns, sprains lacerations, moderate/mild anxiety, fractures/dislocations w/PMS or mild TBI.

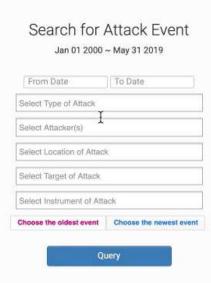
### Attention-based program from Guideline#1



## **Open-Source Systems & Demos**

- COVID-19 Claim Radar (lead author) [Code]
  - A structured claim extraction system, as well as refuting/supporting claim discovery.
- GAIA: A Fine-grained Multimedia Knowledge Extraction System (lead author) [Code]
  - Entity, relation, event extraction with coreference for multilingual (English, Spanish, and Russian) multimedia corpus.
- Cross-lingual Entity Discovery and Linking (lead author) [Code]
  - Entity extraction and coreference for English, Spanish, and Chinese.
- Multilingual Entity, Relation, Event and Human Value Extraction (lead author) [Code]
  - Knowledge extraction system with human values for English, Russian, and Ukrainian.
- RESIN: Schema-Guided Cross-document Cross-lingual Cross-media Event Extraction and Tracking [Code]
  - Schema-Guided cross-document information extraction and tracking system.

## Live Demo: Multimodal Event Recommendation [Manling Li et al., ACL 2020]



# Live Demo: What Would the "SmartBook" Look Like? An Example Chapter

Ukraine Crisis Smart Book

# Chapters >

Overview
What is NATO's position on the

Ukraine-Russia conflict?
What is the position of China

What is the position of Ch on the Ukraine-Russia conflict?

What is the position of the governments of Poland, Turkey and Moldova on the Ukraine-Russia conflict?

What is Venezuela's position on Ukraine-Russia Conflict?

Perspectives

### What is the position of China on the Ukraine-Russia conflict?

#### Summary

China has publicly stated that it does not support the idea of ejecting Russia from the G20, and has instead called for dialogue between all parties involved in the conflict. China has also said that it is opposed to the spread of disinformation about China in an attempt to pressure the country.

#### Claims

Claim Sentence	Context
Since the war began, China has tried to project a neutral stance. Source	Biden-Xi call: A call between Chinese President Xi Jinping and US President Joe Biden was underway Friday. Since the war began, China has tried to project a neutral stance. It has not condemned Russian actions, and has refused to label the attack an invasion, See More
Cooperation with China was ambivalent, he said, adding the country was "struggling with the consequences of its own Covid strategy, which also has consequences for world trade."	While the G7 leaders reemphasized their condemnation of "Russia's unjustifiable, unprovoked and illegal war against Ukraine," they called on China to press Russia to withdraw its troops from Ukraine. Scholz said he also expected China not to undermine sanctions against Russia. Cooperation with China was ambivalent, he said, adding the country was "struggling with the consequences of its own Covid strategy, which also has consequences for world trade." See More
China is firmly opposed to this and will never accept it. Source	The US has indicated that China would pay an economic price if its support for Russia goes beyond rhetoric. Speaking Friday, Zhao repeated China's public rebuke, saying "some people in the US have been spreading disinformation to smear and <u>put pressure on China</u> , which is extremely irresponsible and will not help solve the issue. China is firmly opposed to this and will never accept it." See More
That is considered unlikely, as China has said it would not back kicking Russia out.	While US President Joe Biden has said Russia should no longer be in the G20, ejecting Moscow would require the support of all members. That is considered unlikely, as China has said it would not back kicking Russia out. See More
The White House is realistic the G20 will not collectively remove Russia from its ranks, since the decision would likely require	The White House is realistic the G20 will not collectively remove Russia from its ranks, since the decision would likely require consensus and China has been clear it doesn't support such a move. See More

### Multi-Lingual Claims

consensus and China has been clear it doesn't support such a move.

#### China's position:

Source

#### **Original Post**

中國常駐联合國副代表耿爽:各方都应摒弃政治私利,为化解乌克兰危机做切实努力中國日报联合國9月7日电(记者※受認)当地时间7日、联合國安理会召开会议审议乌克兰人通问题。中国常驻联合国副代表耿爽出席会议并发言表示 弃政治私利,停止整化矛盾。停止制造分裂、停止鼓吹对抗。为化解危机做出切实努力。耿爽说。历史反复证明、外交努力、谈判沟通是化解冲突、结束危机的唯一正确出路。中方再次停吁有关当事方保持对话接触、探索政治解决的可 复和平稳定积累条件。耿爽指出,扎波罗热核电站的安全和安保问题事关乌克兰和整个地区上亿人的健康福祉 问到上周对扎波罗热核电站进行实地考察。赞赏机构专家驻留在核电站继续开展工作。鼓励机构就相关问题同各方保持沟通。

#### Translation (Google)

Geng Shuang, Deputy Permanent Representative of China to the United Nations: All parties should abandon political self-interest and make practical efforts to resolve the Ukrainian crisis China Daily, United Nations, September 7 [Repc 7th local time, the UN Security Council held a meeting to discuss the humanitarian issue in Ukraine, China's Deputy Permanent Representative to the United Nations, Geng Shuang, attended the meeting and said that all parties in the UN Security Council held a meeting to discuss the humanitarian issue in Ukraine.



What is the position of

China on the Ukraine-Russia conflict?

Multi-Lingual Claims

Original Post

Translation (Google)

Summary

Claims

https://blenderdemo.com/smartbook

# **Collaborators**





Advisor

