ATOMIC: An ATlas Of Machine Commonsense for If-Then Reasoning

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Introduction

- ATOMIC, a large-scale knowledge graph of commonsense reasoning
- inferential knowledge through typed if-then relations
- Addresses the gap in machine commonsense for AI systems
- Aids in understanding causes, effects, and mental states related to everyday events

High-Level Summary

- 877K instances of inferential knowledge from 300K events
- Nine if-then reasoning types, including intents, reactions, needs, and attributes
- Taxonomy of relationships (If-Event-Then-Mental-State, If-Event-Then-Event, If-Event-Then-Persona)
- Multitask learning approaches for inference generation

Consider an event



Reasoning Types



Nine Inferential Dimensions

| Event | Type of relations | Inference examples | Inference dim. | |
|--|----------------------------|--|------------------------------------|--|
| | If-Event-Then-Mental-State | PersonX wanted to be nice PersonX will feel good PersonY will feel flattered | xIntent xReact oReact | |
| "PersonX pays PersonY a compliment" | If-Event-Then-Event | PersonX will want to chat with PersonY PersonY will smile PersonY will compliment PersonX back | xWant oEffect oWant | |
| | If-Event-Then-Persona | PersonX is flattering PersonX is caring | xAttr xAttr | |
| | If-Event-Then-Mental-State | PersonX wanted to be helpful PersonY will be appreciative PersonY will be grateful | xIntent oReact oReact | |
| "PersonX makes PersonY's coffee" | If-Event-Then-Event | PersonX needs to put the coffee in the filter PersonX gets thanked PersonX adds cream and sugar | xNeed xEffect xWant | |
| | If-Event-Then-Persona | PersonX is helpful PersonX is deferential | xAttr xAttr | |
| | If-Event-Then-Mental-State | PersonX wants to report a crime Others feel worried | xIntent oReact | |
| "PersonX calls the police" | If-Event-Then-Event | PersonX needs to dial 911 PersonX wants to explain everything to the police PersonX starts to panic Others want to dispatch some officers | xNeed xWant xEffect oWant | |
| | If-Event-Then-Persona | PersonX is lawful PersonX is responsible | xAttr xAttr | |

Free Form Crowdsourced Data

Event

PersonX pays PersonY a compliment

Before

1. Does PersonX typically need to do anything before this event?

After

2. What does PersonX likely want to do next after this event?

| | | |
|--|------|--|
| | | |

3. Does this event affect people other than PersonX?

(e.g., PersonY, people included but not mentioned in the event)

●Yes ●No

a). What do they likely want to do next after this event?

Single vs. Multitask Learning

- 9ENC9DEC
- EVENT2(IN)VOLUNTARY
- EVENT2PERSONX/Y
- EVENT2PRE/POST

BLEU Scores

| Dataset | Model | xIntent | xNeed | xAttr | xEffect | xReact | xWant | oEffect | oReact | oWant |
|---------|--|----------------------|--------------------------------|---------------------|------------------------|----------------------|-------------------------|----------------------|----------------------|--------------------------------|
| Dev | 9ENC9DEC NearestNeighbor | 8.35 6.14 | 17.68 11.36 | 5.18 3.57 | 10.64 5.81 | 5.38 4.37 | 13.24 7.73 | 6.49 8.02 | 5.17 6.38 | 12.08 8.94 |
| | Event2(In)voluntary Event2PersonX/Y Event2Pre/Post | 7.51 7.31 7.58 | 17.80 17.08 17.17 | 5.18 5.26 | 10.51 9.78 10.50 | 4.78 4.83 4.73 | 12.76 12.14 11.78 | 7.04 6.38 6.71 | 4.84 4.84 4.87 | 12.48 11.45 11.52 |
| Test | 9ENC9DEC NearestNeighbor | 8.68 6.64 | 18.15 11.35 | 5.18 3.37 | 10.34 5.52 | 5.43 4.59 | 14.50 8.17 | 6.61 7.58 | 5.08 5.88 | 12.73 9.18 |
| | Event2(In)voluntary Event2PersonX/Y Event2Pre/Post | 7.94 7.67 7.96 | 18.22 17.33 17.42 | 5.02 5.09 - | 9.78 9.45 9.79 | 4.78 4.82 4.75 | 13.67 13.19 12.85 | 7.16 6.59 6.90 | 4.71 4.68 4.76 | 13.23 11.70 11.97 |

Human Evaluation

| Model | xNeed | xIntent | xAttr | xEffect | xReact | xWant | oEffect | oReact | oWant average |
|--|--------------------------------|--------------------------------|--------------------------------|--------------------------------|--------------------------------|--------------------------------|--------------------------------|--------------------------------|--------------------------------|
| 9enc9dec | 48.74 | 51.70 | 52.20 | 47.52 | 63.57 | 51.56 | 22.92 | 32.92 | 35.50 45.32 |
| Event2(In)voluntary Event2PersonX/Y Event2Pre/Post | 49.82 54.04 47.94 | 61.32 53.93 57.77 | 52.58 52.98 52.20 | 46.76 48.86 46.78 | 71.22 66.42 72.22 | 52.44 54.04 47.94 | 26.46 24.72 26.26 | 36.04 33.80 34.48 | 34.7047.9335.0846.4135.7846.76 |
| gold ATOMIC annotations | 81.98 | 91.37 | 78.44 | 83.92 | 95.18 | 90.90 | 84.62 | 86.13 | 83.12 86.18 |

Strengths

- Focuses on inferential knowledge, unlike taxonomic datasets
- Largest dataset of its kind, with validated human annotations.
- Enables AI systems to predict plausible causes, effects, and motivations for unseen events.

Weaknesses

- Crowdsourced data might include biases or noise, despite validation.
- Focuses mainly on single-step inferences and lacks multi-turn reasoning for complex narratives.
- While innovative, there is minimal overlap with datasets like ConceptNet (~7%), raising integration questions.

Story Generation and Interactive Fiction

• Story Generation:

- Use ATOMIC to model characters' motivations, actions, and consequences dynamically.
- Enhance plot consistency through plausible event sequences.

• Interactive Fiction:

- Implement character-driven decision-making (e.g., emotional reactions or needs).
- Enable AI to adapt storylines based on player actions.

• Future Use Cases:

- Dynamic branching narratives where NPCs' actions/reactions feel realistic.
- Building richer character backstories by inferring unstated motivations.

Example Application

• Scenario:

- Player chooses to "save an NPC."
- Using ATOMIC:
 - Predict NPC's gratitude or next steps (e.g., offering a reward).
 - Generate subsequent events influenced by inferred motives (e.g., NPC accompanies the player).

• Interactive Fiction Enhancement:

• Enables more immersive storytelling by modeling plausible cause-effect relationships.

thank you