# Reasoning Technologies at SRI

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Vision and Learning,

**Center for Vision Technologies** 

## **Capability Summary**

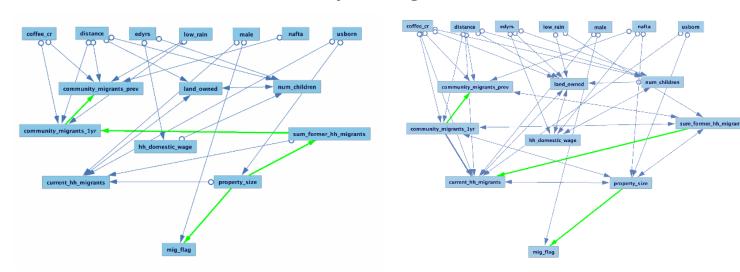
- Key relevant capabilities
  - Causal discovery and inference
  - Comprehension using large language models
  - Multi-modal data analytics
- Key relevant government programs
  - DARPA KMASS, AFRL MESA, ONR CEROSS, DARPA CCU, DARPA Civil Sanctuary, DARPA MIPS
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Causal Discovery Aided Tabular Data Analytics

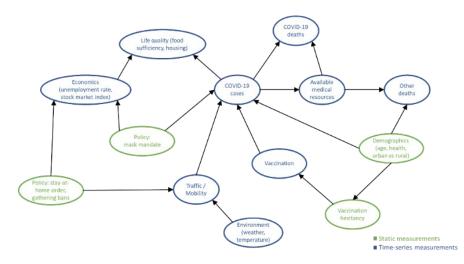
- Discover causal relationships in the data to exclude the influence of spurious correlations on successive analysis
- Employ hierarchical transformers to process dynamic tabular data including both categorical and continuous inputs for a wide range of tasks, e.g., prediction, classification, etc.
- Leverage transformer's generative capability, in conjunction with discovered causal diagrams, to perform counterfactual analysis

# Sequence Encoding Transformer Field Graph Transformer Field<sub>12</sub> Field<sub>13</sub> Field<sub>14</sub> Field<sub>15</sub> Field<sub>16</sub> Field<sub>17</sub> Field<sub>17</sub> Field<sub>17</sub> Field<sub>17</sub> Field<sub>18</sub> Causal Diagram

#### **Causal Discovery on Migration Dataset**

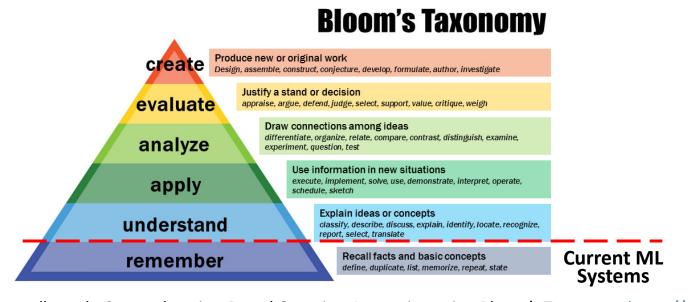


#### **Causal Discovery on Covid19 Dataset**



# Comprehension Using Large Language Models

- Motivation: Bloom's taxonomy as a science grounded graded approach to learning and accessing comprehension
- Approaches: 1) Defined comprehension using Bloom's Taxonomy; 2) Operationalized Bloom's Taxonomy via proximal context, the proximal context for Level n comes from Level n-1;
   3) use proximal context to generate prompts and improve QA
- Advantages: Task agnostic, No additional learning



Task	Model	Level	Accuracy
Winogrande (1267 total) (2: Understand)	Distil-GPT2 (235±5 valid) GPT-Neo (1230±7 valid)	0A: Choice Baseline 1A: Remember* 2A: Understand 0A: Choice Baseline 1A: Remember* 2A: Understand	$53.2 \pm 1.8$ $54.7 \pm 3.6$ $52.5 \pm 3.1$ $54.62 \pm 0.5$ $54.77 \pm 0.5$ $54.76 \pm 0.3$
SocialIQA (1954 total) (3: Apply)	Distil-GPT2 (58±5 valid) GPT-Neo (1334±9 valid)	0B: Choice Baseline 1B: Remember 2B: Understand* 3B: Apply 0B: Choice Baseline 1B: Remember 2B: Understand* 3B: Apply	$44.5 \pm 0.1$ $43.7 \pm 2.1$ $48.0 \pm 1.1$ $44.4 \pm 1.8$ $48.74 \pm 0.4$ $47.31 \pm 0.1$ $48.44 \pm 0.5$ $48.1 \pm 0.1$
COPA (100 total) (3: Apply)	Distil-GPT2 (11±2 valid) GPT-Neo (96±0 valid)	0C: Choice Baseline 1C: Remember 2C: Understand* 3C: Apply 0C: Choice Baseline 1C: Remember 2C: Understand* 3C: Apply	$54.9 \pm 0.9$ $46.0 \pm 14.7$ $53.1 \pm 12.5$ $40.8 \pm 15.2$ $70.83 \pm 0.0$ $65.62 \pm 0.0$ $70.83 \pm 1.4$ $70.83 \pm 0.0$
CommonsenseQA (1221 total) (3: Apply)	Distil-GPT2 (68±1 valid) GPT-Neo (1118±4 valid)	0D: Choice Baseline 1D: Remember 2D: Understand* 3D: Apply 0D: Choice Baseline 1D: Remember 2D: Understand* 3D: Apply	$29.9 \pm 2.7$ $26.5 \pm 3.3$ $28.1 \pm 1.2$ $25.6 \pm 3.4$ $40.59 \pm 3.6$ $38.00 \pm 6.0$ $43.19 \pm 0.2$ $42.30 \pm 0.8$

M. Cogswell, et al., Comprehension Based Question Answering using Bloom's Taxonomy, <a href="https://arxiv.org/pdf/2106.04653.pdf">https://arxiv.org/pdf/2106.04653.pdf</a>

## Multi-Modal Data Analytics

- Multimodal Question Answering
  - DARPA KMASS
- Multimodal Social Media Analytics
  - DARPA MIPS (Influence Pathways), DARPA Civil Sanctuary (Content Moderation and Mediation)

# Hierarchical Transformer-based Reasoning System Modality Encoders

