

Does this person have 20/20 vision? What is just under the tree?

(Malinowski and Fritz 2014), (Antol et al. 2015), (Yu et al. 2015)

- **Object semantics:** What is ...
- Colors: What color ...
- Yes/No: Does the...

Counting: How many ... 

## no reasoning

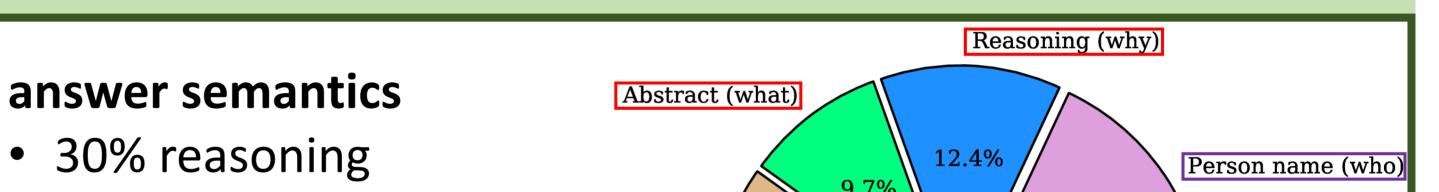
- does not capture image  $\bullet$ semantics or story
- essentially classical vision tasks with machine dialog

| <ul> <li>Kere</li> <li>Kere<th>The Matrix has you          About to disconnect when an anonymous message slices onto the screen.         SCREEN         Do you want to know what the Matrix is, Neo?         0:00       0:15         0:30</th><th>neural-interactive simulation y<math>00:40:47</math>&gt; <math>00:40:48</math><math>01:0</math></th><th><math display="block"> \begin{array}{c}                                     </math></th></li></ul> | The Matrix has you          About to disconnect when an anonymous message slices onto the screen.         SCREEN         Do you want to know what the Matrix is, Neo?         0:00       0:15         0:30 | neural-interactive simulation y $00:40:47$ > $00:40:48$ $01:0$   | $ \begin{array}{c}                                     $  |  |  |  |
|--|--|--|---|--|--|--|
| ١  | Who kills Neo in the Matrix?   | Why does Cypher betray Morpheus?   | How does the movie end?   |  |  |  |
| ŀ  | <b>A:</b> Smith kills Neo  | A: In exchange for a comfortable life  | A: With Neo flying into the sky   |  |  |  |
| <b>QUIZ</b><br>r   | A: Trinity kills Neo<br>A: Morpheus kills Neo after he<br>realizes that Neo is not the one<br>A: Neo commits suicide   | <ul> <li>A: In exchange for money</li> <li>A: Because he is threatened by Agent<br/>Smith</li> <li>A: Because he hates Morpheus</li> </ul> | <ul> <li>A: With the Machines chasing after Neo</li> <li>A: We see Mr. Smith torture Morpheus</li> <li>A: Trinity escapes from the rooftops</li> <li>A: Neo duels and kills Morpheus</li> </ul> |  |  |  |

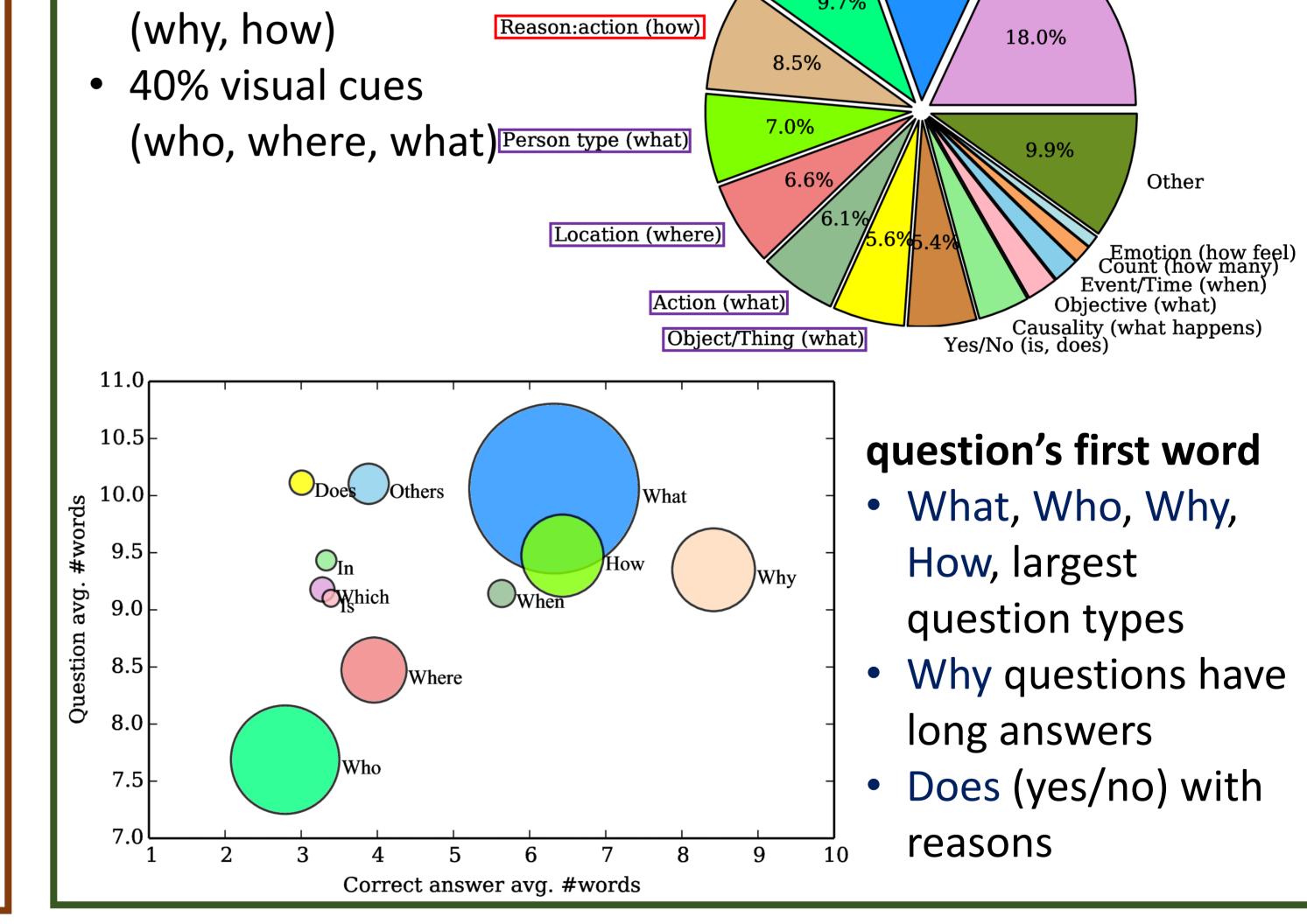
## **Benchmark dataset**

**Analysis of question types** 

- 408 movies, 14,944 questions, 5 *deceiving* answer options
- video clips with mean duration **200** seconds, **46** shots



|                                 | TRAIN | VAL   | TEST  | TOTAL              |  |  |  |  |  |
|---------------------------------|-------|-------|-------|--------------------|--|--|--|--|--|
|                                 |       |       |       | IUIAL              |  |  |  |  |  |
| Movies with Plots and Subtitles |       |       |       |                    |  |  |  |  |  |
| # Movies                        | 269   | 56    | 83    | 408                |  |  |  |  |  |
| # QA                            | 9,848 | 1,958 | 3,138 | 14,944             |  |  |  |  |  |
| Q #words                        | 9.3   | 9.3   | 9.5   | 9.3 ± 3.5          |  |  |  |  |  |
| CA. #words                      | 5.7   | 5.4   | 5.4   | $5.6 \pm 4.1$      |  |  |  |  |  |
| WA. #words                      | 5.2   | 5.0   | 5.1   | 5.1 ± 3.9          |  |  |  |  |  |
| Movies with Video Clips         |       |       |       |                    |  |  |  |  |  |
| # Movies                        | 93    | 21    | 26    | 140                |  |  |  |  |  |
| # QA                            | 4,318 | 886   | 1,258 | 6,462              |  |  |  |  |  |
| # Video clips                   | 4,385 | 1,098 | 1,288 | 6,771              |  |  |  |  |  |
| Clip dur. (s)                   | 201   | 198.5 | 211.4 | 202.7 <u>+</u> 216 |  |  |  |  |  |



## **Comparing QA datasets**

## More examples

|   | Txt          | Img          | Vid          | Goal                             | Data source        | Answering    | #Q    | AW   | Q. What does Morpheus offer                             |
|---|--------------|--------------|--------------|----------------------------------|--------------------|--------------|-------|--|---|
| MCTest  | $\checkmark$ | -            | -            | reading comprehension            | children's stories | MC (4)       | 2.6K  | 3.4  | Neo when they meet?<br>A1. A yellow pill and green pill |
| bAbl  | $\checkmark$ | -            | -            | reasoning for toy tasks          | synthetic          | Word         | 40K   | 1.0  | A2. A red pill and blue pill                            |
| News article  | $\checkmark$ | -            | -            | information abstraction          | news articles      | Word         | 1M*   | 1*   | A3. Vitamins  |
| DAQUAR  | -            | $\checkmark$ | -            | visual: counts, colors, objects, | NYU-RGBD           | Word List    | 12.5K | 1.2  | Q. What is Nebuchadnezzar?                              |
| Visual Madlibs  | -            | $\checkmark$ | -            | visual: scene, objects, people,  | COCO + Prompts     | FiTB/MC (4)  | 150K  | 2.6  | A1. A restaurant<br>A2. Agent Smith's hovercraft        |
| VQA (v1)  | -            | $\checkmark$ | -            | visual understanding             | COCO + Abstract    | Open/MC (18) | 764K  | 1.2  | A3. Morpheus's hovercraft                               |
| MovieQA   | $\checkmark$ | $\checkmark$ | $\checkmark$ | movie story comprehension        | movie stories      | MC (5)       | 15K   | 5.3  | Q. Does Morpheus escape the                             |
| <ul> <li>MCTest Richardson et al. MCTest: A Challenge Dataset for the Open-domain Machine Comprehension of Text. In <i>EMNLP</i>, 2013.</li> <li>Weston et al. Towards AI-Complete Question Answering: A Set of Prerequisite Toy Tasks. arXiv, 2014.</li> <li>News Hermann et al. Teaching Machines to Read and Comprehend. In <i>NIPS</i>, 2015</li> <li>DAQUAR Malinowski and Fritz. A Multi-World Approach to Question Answering about Real-World Scenes based on Uncertain Input. In <i>NIPS</i>, 2014</li> <li>Yu et al. Visual Madlibs: Fill in the Blank Image Generation and Question Answering. In <i>ICCV</i>, 2015</li> <li>Antol et al. VQA: Visual Question Answering. In <i>ICCV</i>, 2015</li> </ul> |              |              |              |                                  |                    |              |       | Agents?<br>A1. Yes, Neo and Trinity help<br>A2. Yes, Morpheus drugs them<br>A3. No, he is captured and<br>tortured |   |

**SCRIPT** 

**VIDEO** 

MORPHEUS: Come with me, see for yourself. MORPHEUS: This is my ship, the Nebuchadnezzar. It's a hovercraft.

**CVPR**2016

the **PLOT** Neo resolves to return to the Matrix to rescue elp Morpheus, and Trinity them accompanies him. They succeed in rescuing Morpheus.