Vision as Inverse Graphics

Machine learning techniques towards a program-based model for scene understanding

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Scene Understanding

Recognize objects and components

Answer questions about scene



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Why is scene understanding hard

Scene understanding is easy for humans.

What is this a picture of?

What is the man doing?

What is the man's jersey number?

How fast is the horse going?

These questions are second nature for humans to answer, but are really difficult for a computer.



Scene Understanding





Scene Understanding





Current approaches

Classify objects and infer the scene context based on the types of objects present

Types of objects present: Horse, Human, Stick, Grass, Tree —> Scene is Polo

Top-down approach; gets the gist of the scene

Google image captioner

A person riding a motorcycle on a dirt road.



A group of young people playing a game of frisbee.



A herd of elephants walking across a dry grass field.



Two dogs play in the grass.



Two hockey players are fighting over the puck.



A close up of a cat laying on a couch.



A skateboarder does a trick



A little girl in a pink hat is



A red motorcycle parked on the



A dog is jumping to catch a



A refrigerator filled with lots of food and drinks.



A yellow school bus parked



Describes without errors

Describes with minor errors

Somewhat related to the image

Unrelated to the image

Image source: Google paper "Show and Tell: A Neural Image Caption Generator," CVPR 2015

Another example

Computer: A zebra, of course!

Human: A horse in a zebra costume, of course!



Current approaches lack **compositionality**

A *compositional representation* is one where complicated objects or scenes are represented by putting together simpler parts.

Compositionality is second nature to humans, but not to computers!

Alternative approach

Goal: accomplish scene understanding by creating an **abstraction** that includes information about the following:

- The type of each object and each component
- How each component is related to the object that it is a part of, and vice versa (thereby encoding the specifics of each object)

Vision as inverse graphics

Alternate paradigm:

Analyze an image by attempting to synthesize it

Program-based model

