

Towards Visual Understanding...



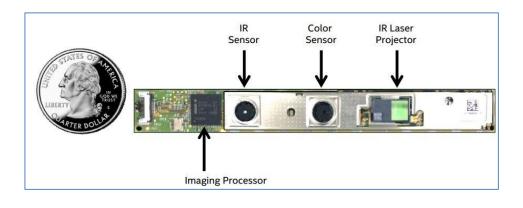
#### Real Sense is ...







#### **OEM Designs**





Lenovo ThinkPad\* Yoga 15

#### **PerC SW Research**



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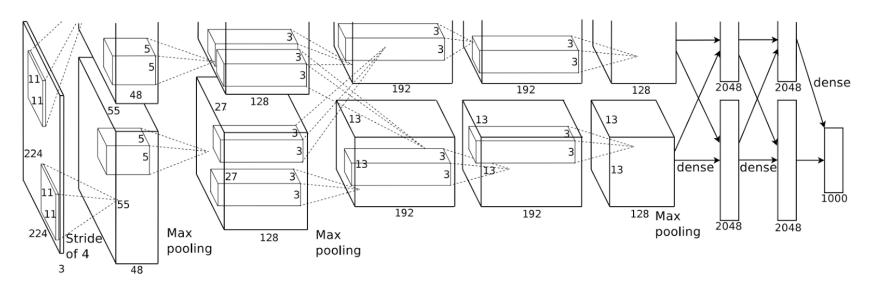
# The Future...

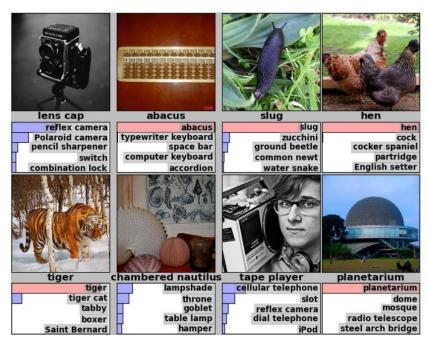






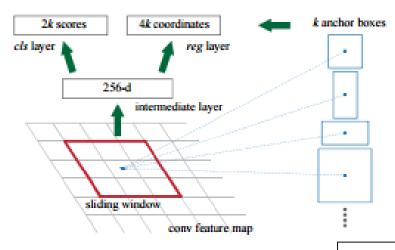
#### Deep Learning & CNN's ("Alexnet")



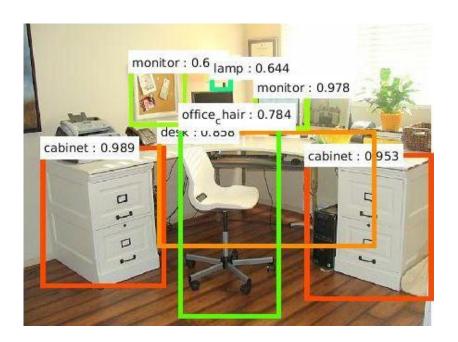


Krizhevsky, et al, 2012

#### **Object Detection (Faster R-CNN)**

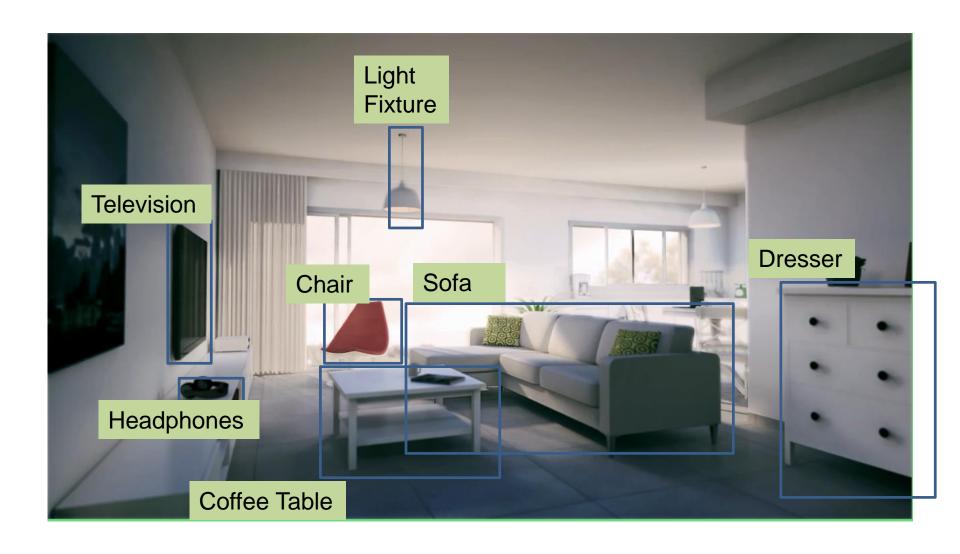


Ren, He, Girshick, Sun, 2015

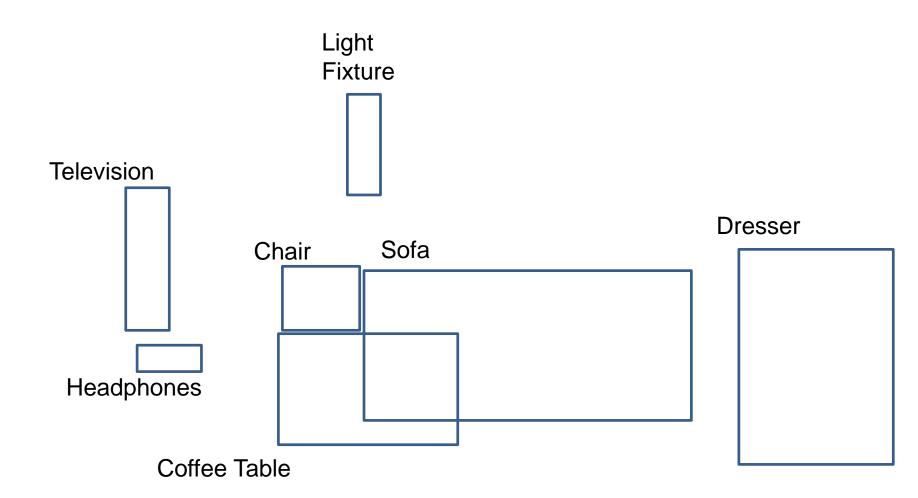




# **Object Recognition & Detection**

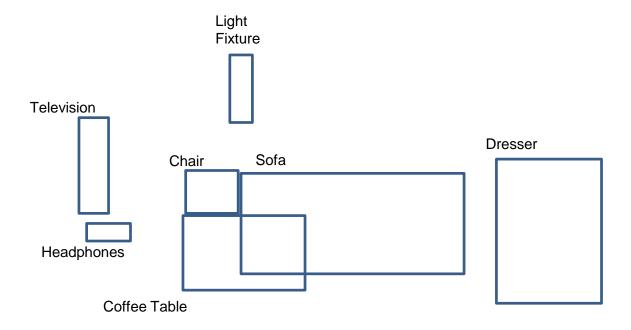


# Today's Capabilities...

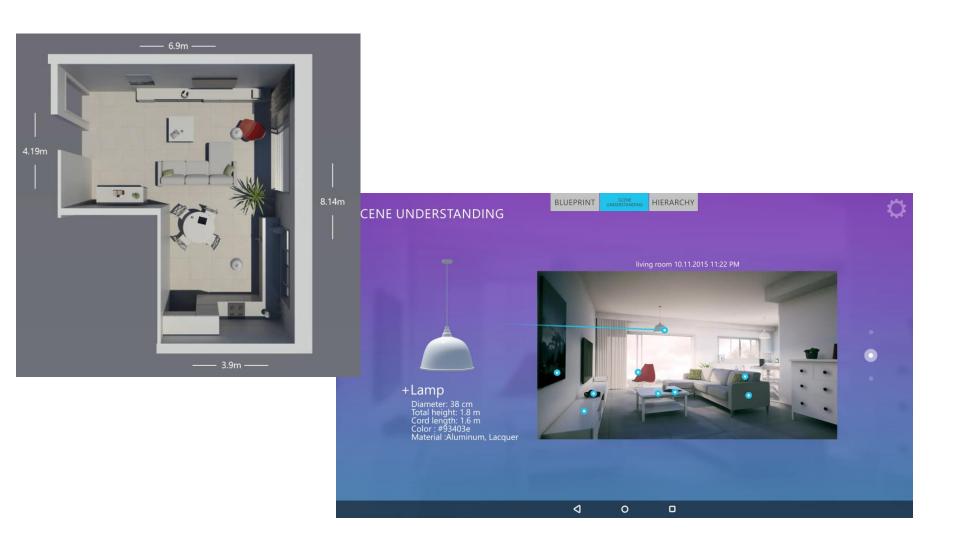


#### ... are not quite sufficient

- "Robot, bring me my headphones."
- "What would the room look like if I replace the sofa with this loveseat?"
- "Does that chair swivel?"



#### We want...



#### Scene Understanding is ...

- Identify everything (that I can) in the scene
  - The space it occupies
  - Its boundaries
- Relationships & Interactions
  - Object-object
  - Person-object
- Character & Function
  - Does it move? Is it articulated?
  - What is it composed of?
  - What is it used for?

# **Step 1: Acquire 3D Geometry**



#### 3D Capture



# Depth data from a single frame is:

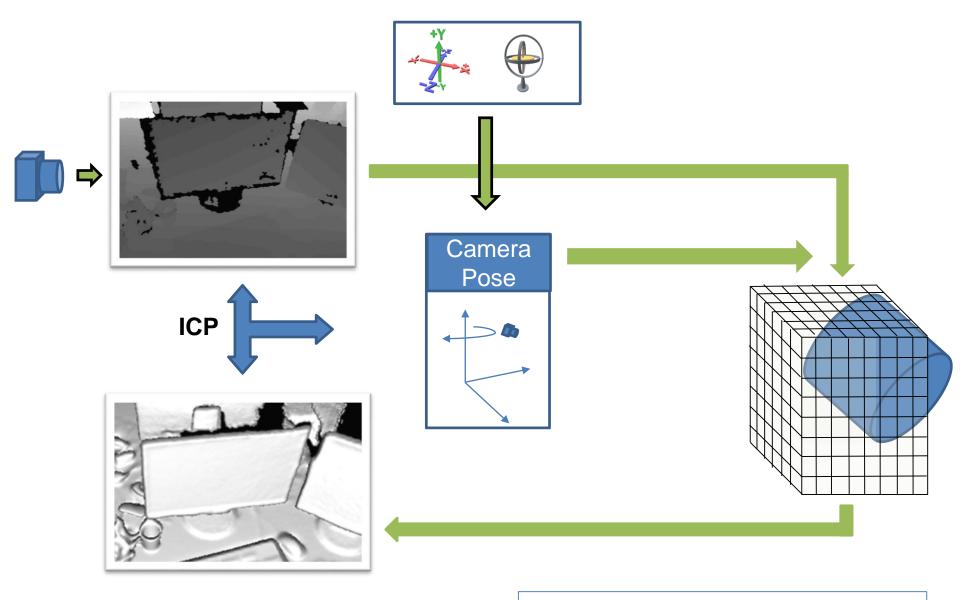
- Noisy
- Incomplete
- Occluded



#### Solution:

- 1. Scan the camera and calculate its pose at each frame.
- 2. Transform each frame and accumulate all the 3D points into a single volume.

# **Depth Fusion**



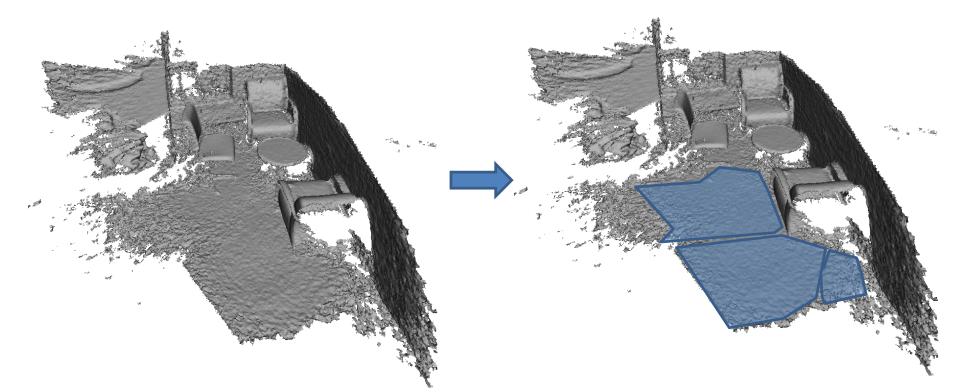
Izadi, et al., "KinectFusion:...", 2011

# 1. 3D Capture

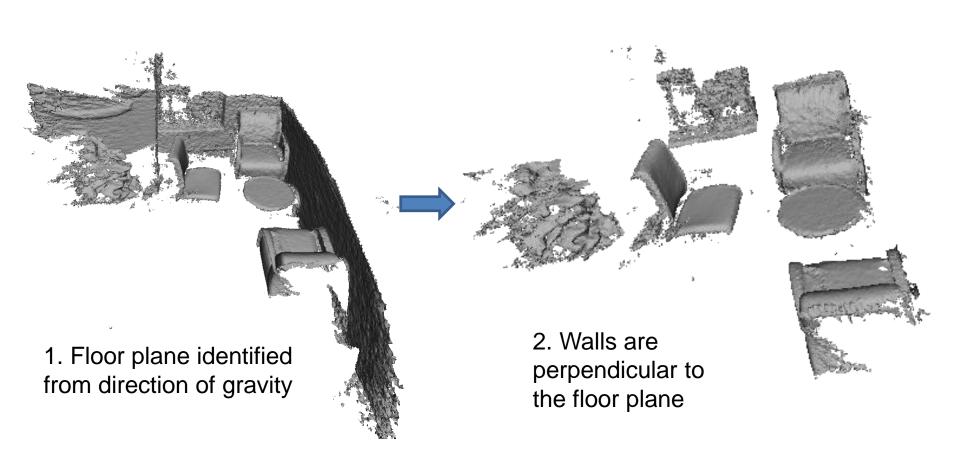


#### 2. Segmentation

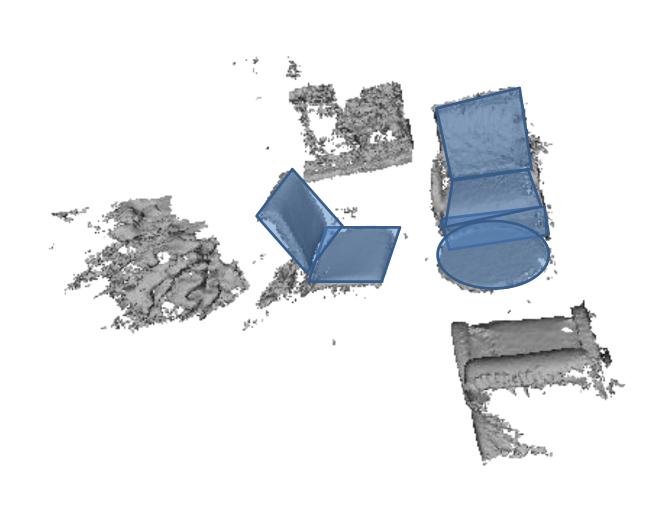
- Fit planes to flat surfaces in the scene
- Merge similar planes:
  - Approximately planar with one another
  - "Close" to one another



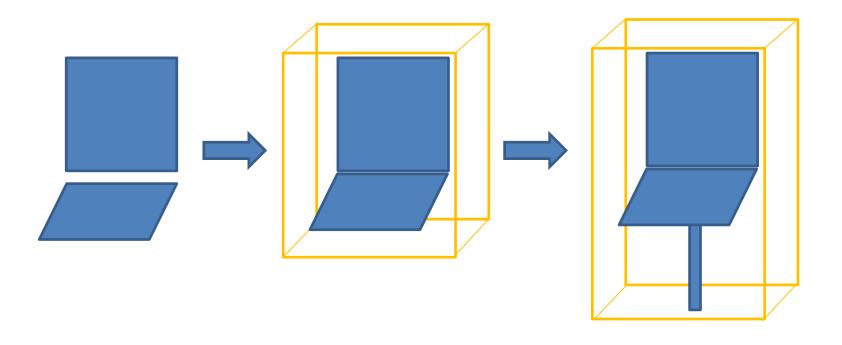
#### **Generate Object Candidates**



# **Bound Objects with Plane Primitives**



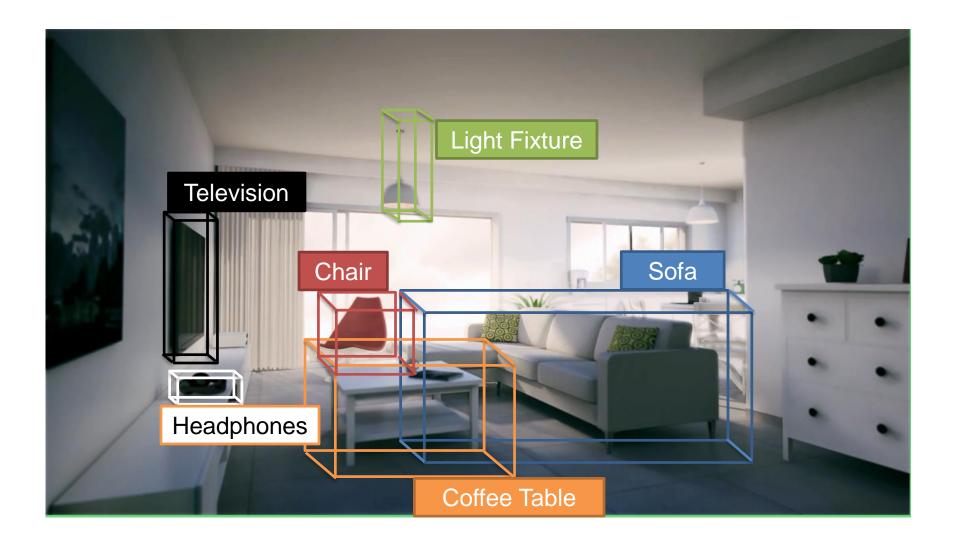
#### Merge Planes Together to Form Candidates



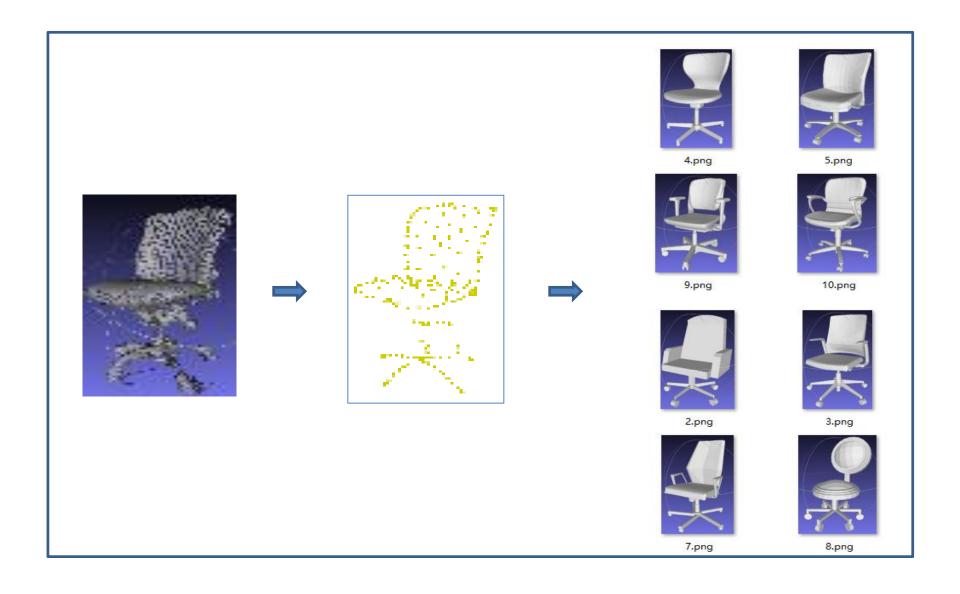
# 3. 3D Bounding Boxes



# 4. Object Recognition



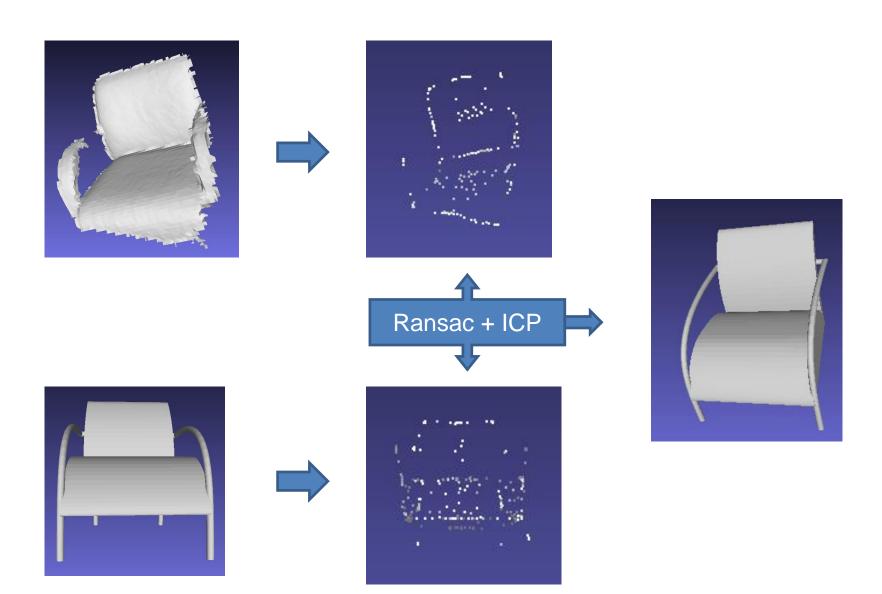
# 5. Object Retrieval



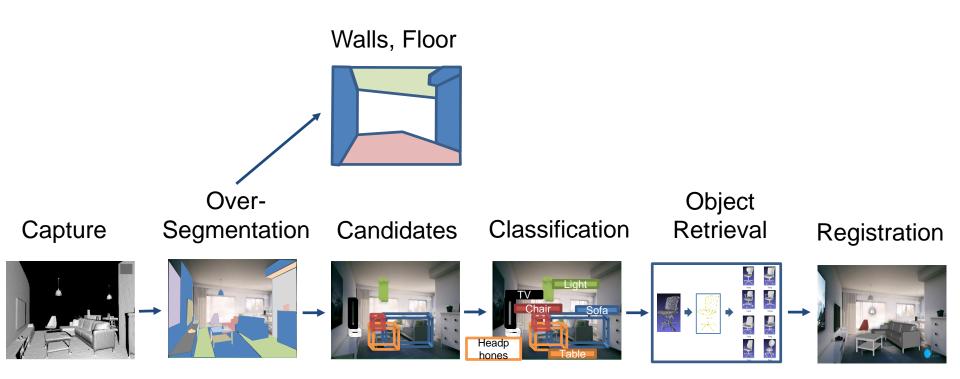
# 6. 3D Registration



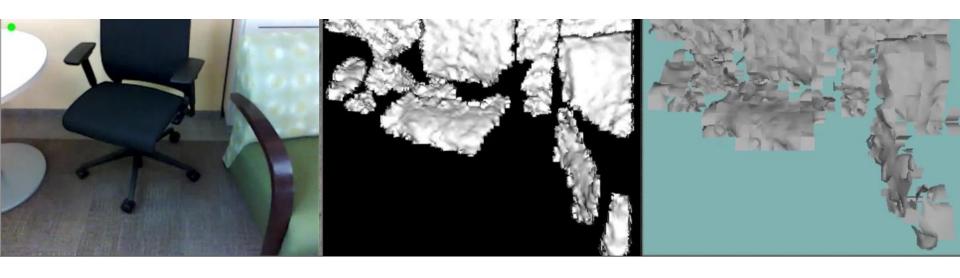
# **3D Registration**



#### Scene Understanding Pipeline



#### Move from pixel-level capture to semantic-level







We are hiring ...