



Marburg  
University

# Lecture

# Computer Vision

## Chapter 1 – Part 1

# Introduction / Motivation

Prof. Dr. Ralph Ewerth

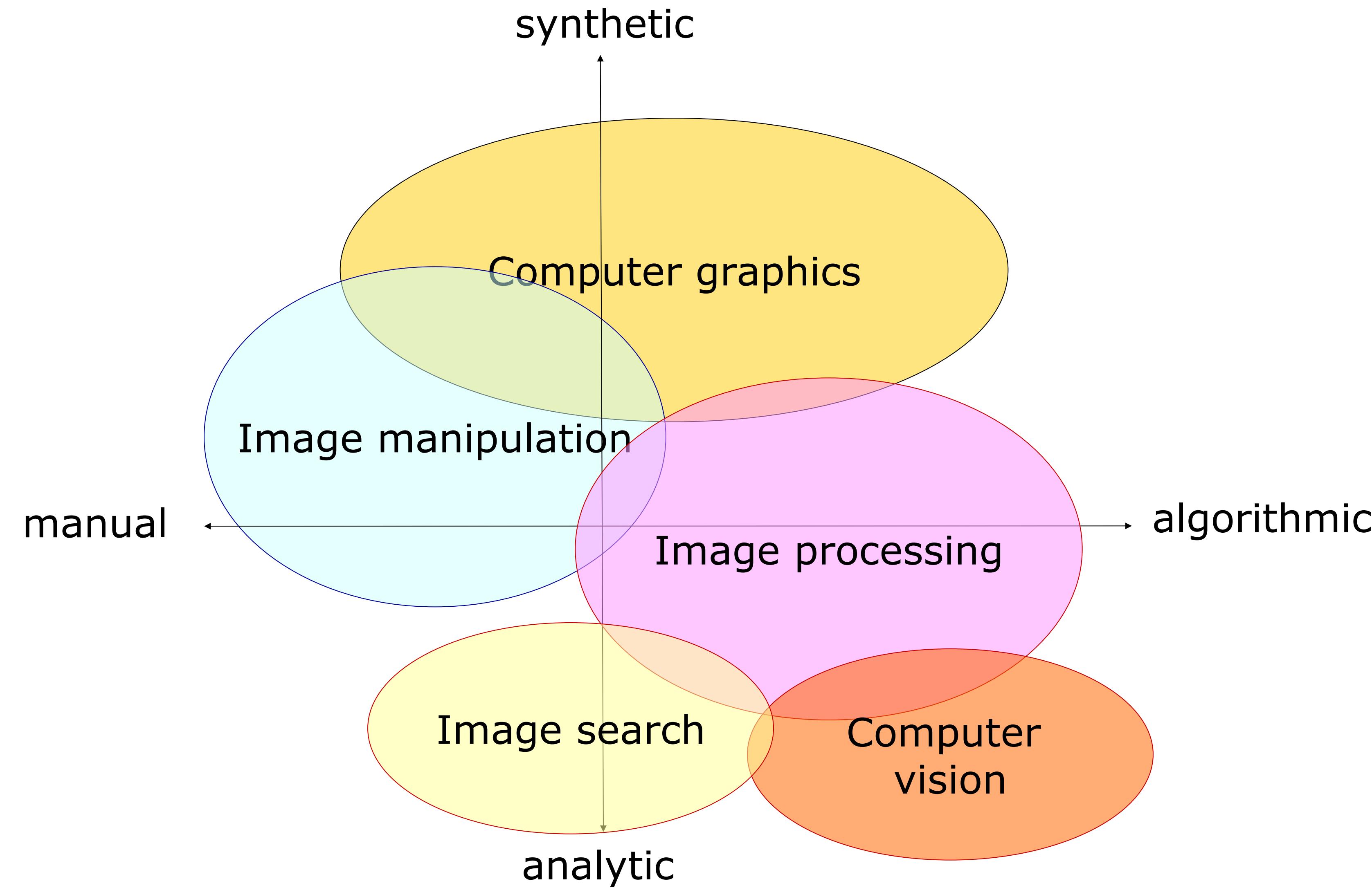
Research Group AI – Multimodal Modelling and Machine Learning

Department of Mathematics and Computer Science

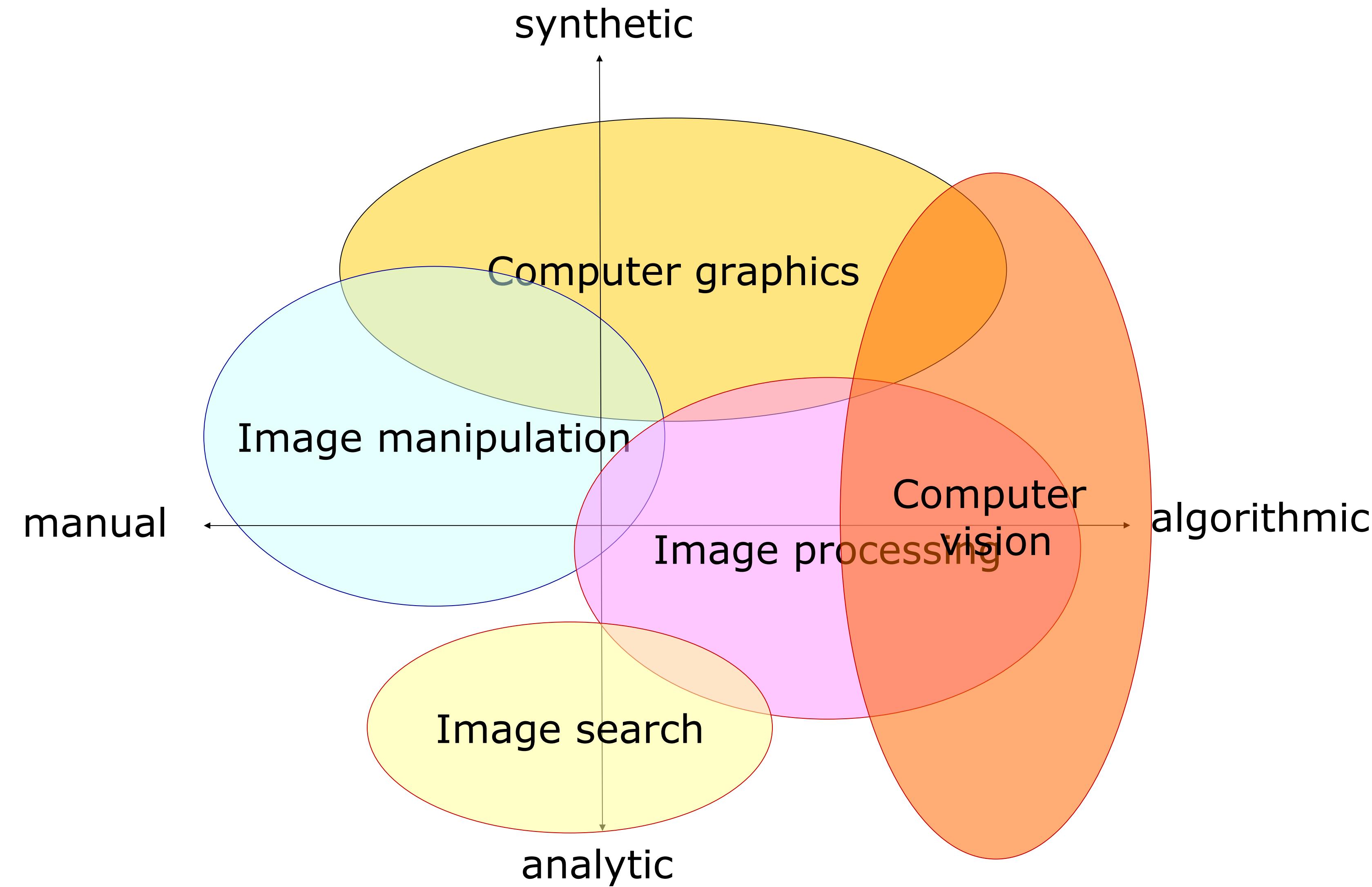
Marburg University & Hessian Center for Artificial Intelligence (hessian.AI)



# Computer Vision & Visual Computing



# Computer Vision & Visual Computing



# Chapters 1 & 2

## The Challenge of Vision

168 168 172 164 158 167 173 167 163 162 164  
175 178 179 176 118 97 168 175 171 169 175  
171 170 177 175 116 109 169 177 173 168 175  
175 167 161 157 138 103 112 157 164 159 160  
165 167 164 178 167 77 55 134 170 167 162  
165 180 180 150 89 61 34 137 186 186 182  
147 169 180 163 51 24 32 119 163 175 182  
149 150 147 148 62 36 46 114 157 163 167  
125 115 129 132 74 54 41 104 156 152 156  
145 144 149 143 71 31 29 129 164 157 155  
177 177 181 174 54 21 29 136 190 180 179  
173 174 180 150 27 101 94 74 189 188 186  
163 161 167 100 45 169 166 59 136 184 176  
155 160 155 56 111 182 180 104 84 168 172  
175 179 133 86 191 201 204 191 79 172 220  
182 124 32 109 168 171 167 163 51 105 203  
197 175 149 169 189 190 173 160 145 156 202  
155 173 182 179 177 182 177 182 185 179 177

# To see

“What does it mean, to see? The plain man's answer (and Aristotle's, too). would be, to know what is where by looking.”

To discover from images what is present in the world, where things are, what actions are taking place, to predict and anticipate events in the world.

# VISION

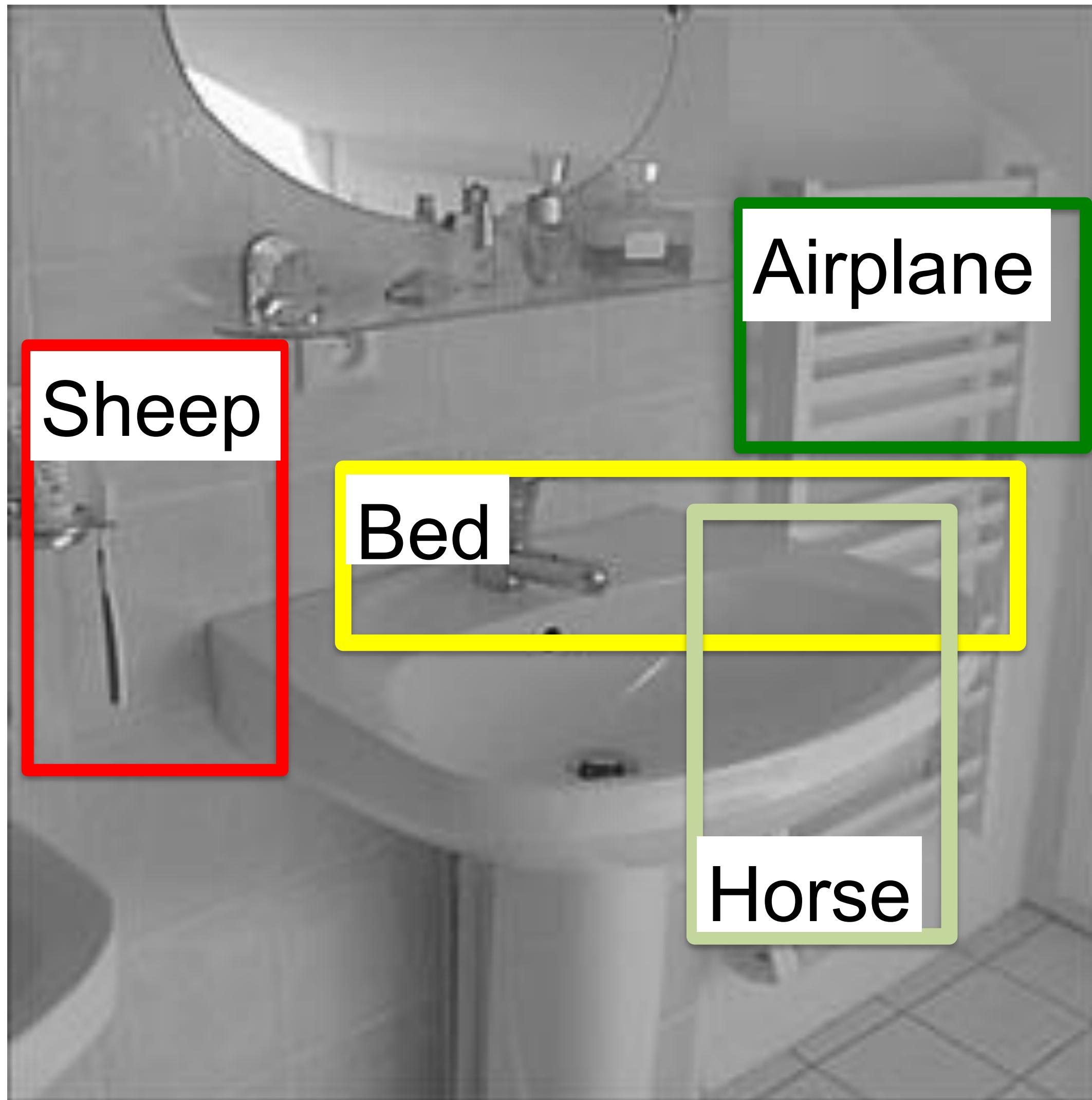


David Marr

FOREWORD BY  
Shimon Ullman

AFTERWORD BY  
Tomaso Poggio

# When some of us started...



# Exciting times in computer vision

“A cup of coffee”



“A cat”



“A cup of cat”



[https://www.reddit.com/r/dalle2/comments/y4mygn/a\\_cup\\_of\\_cat/](https://www.reddit.com/r/dalle2/comments/y4mygn/a_cup_of_cat/)

# The challenge of vision

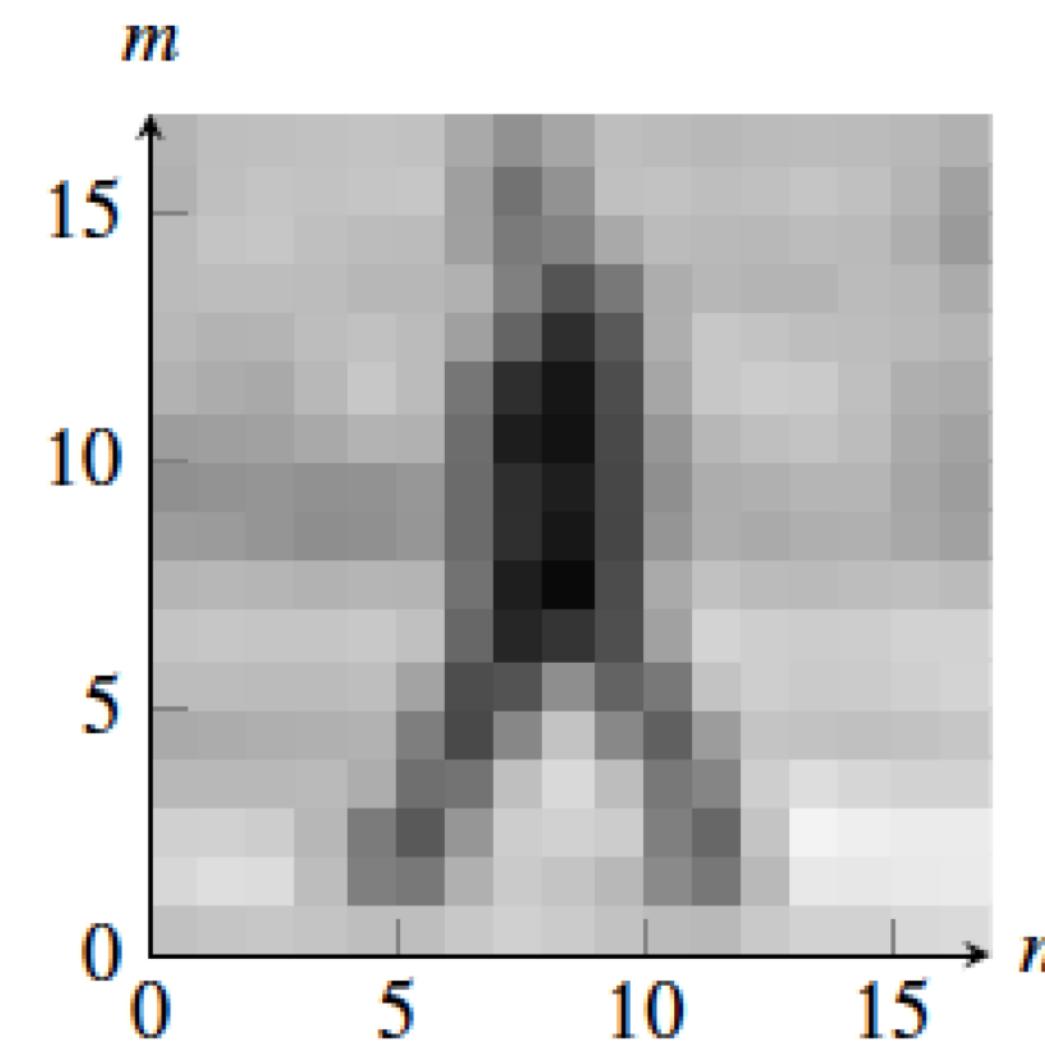
# The input

What the machine gets

$$\mathbf{I} = \begin{bmatrix} 160 & 175 & 171 & 168 & 168 & 172 & 164 & 158 & 167 & 173 & 167 & 163 & 162 & 164 & 160 & 159 & 163 & 162 \\ 149 & 164 & 172 & 175 & 178 & 179 & 176 & 118 & 97 & 168 & 175 & 171 & 169 & 175 & 176 & 177 & 165 & 152 \\ 161 & 166 & 182 & 171 & 170 & 177 & 175 & 116 & 109 & 169 & 177 & 173 & 168 & 175 & 175 & 159 & 153 & 123 \\ 171 & 174 & 177 & 175 & 167 & 161 & 157 & 138 & 103 & 112 & 157 & 164 & 159 & 160 & 165 & 169 & 148 & 144 \\ 163 & 163 & 162 & 165 & 167 & 164 & 178 & 167 & 77 & 55 & 134 & 170 & 167 & 162 & 164 & 175 & 168 & 160 \\ 173 & 164 & 158 & 165 & 180 & 180 & 150 & 89 & 61 & 34 & 137 & 186 & 186 & 182 & 175 & 165 & 160 & 164 \\ 152 & 155 & 146 & 147 & 169 & 180 & 163 & 51 & 24 & 32 & 119 & 163 & 175 & 182 & 181 & 162 & 148 & 153 \\ 134 & 135 & 147 & 149 & 150 & 147 & 148 & 62 & 36 & 46 & 114 & 157 & 163 & 167 & 169 & 163 & 146 & 147 \\ 135 & 132 & 131 & 125 & 115 & 129 & 132 & 74 & 54 & 41 & 104 & 156 & 152 & 156 & 164 & 156 & 141 & 144 \\ 151 & 155 & 151 & 145 & 144 & 149 & 143 & 71 & 31 & 29 & 129 & 164 & 157 & 155 & 159 & 158 & 156 & 148 \\ 172 & 174 & 178 & 177 & 177 & 181 & 174 & 54 & 21 & 29 & 136 & 190 & 180 & 179 & 176 & 184 & 187 & 182 \\ 177 & 178 & 176 & 173 & 174 & 180 & 150 & 27 & 101 & 94 & 74 & 189 & 188 & 186 & 183 & 186 & 188 & 187 \\ 160 & 160 & 163 & 163 & 161 & 167 & 100 & 45 & 169 & 166 & 59 & 136 & 184 & 176 & 175 & 177 & 185 & 186 \\ 147 & 150 & 153 & 155 & 160 & 155 & 56 & 111 & 182 & 180 & 104 & 84 & 168 & 172 & 171 & 164 & 168 & 167 \\ 184 & 182 & 178 & 175 & 179 & 133 & 86 & 191 & 201 & 204 & 191 & 79 & 172 & 220 & 217 & 205 & 209 & 200 \\ 184 & 187 & 192 & 182 & 124 & 32 & 109 & 168 & 171 & 167 & 163 & 51 & 105 & 203 & 209 & 203 & 210 & 205 \\ 191 & 198 & 203 & 197 & 175 & 149 & 169 & 189 & 190 & 173 & 160 & 145 & 156 & 202 & 199 & 201 & 205 & 202 \\ 153 & 149 & 153 & 155 & 173 & 182 & 179 & 177 & 182 & 177 & 182 & 185 & 179 & 177 & 167 & 176 & 182 & 180 \end{bmatrix}$$

# The input

What we see

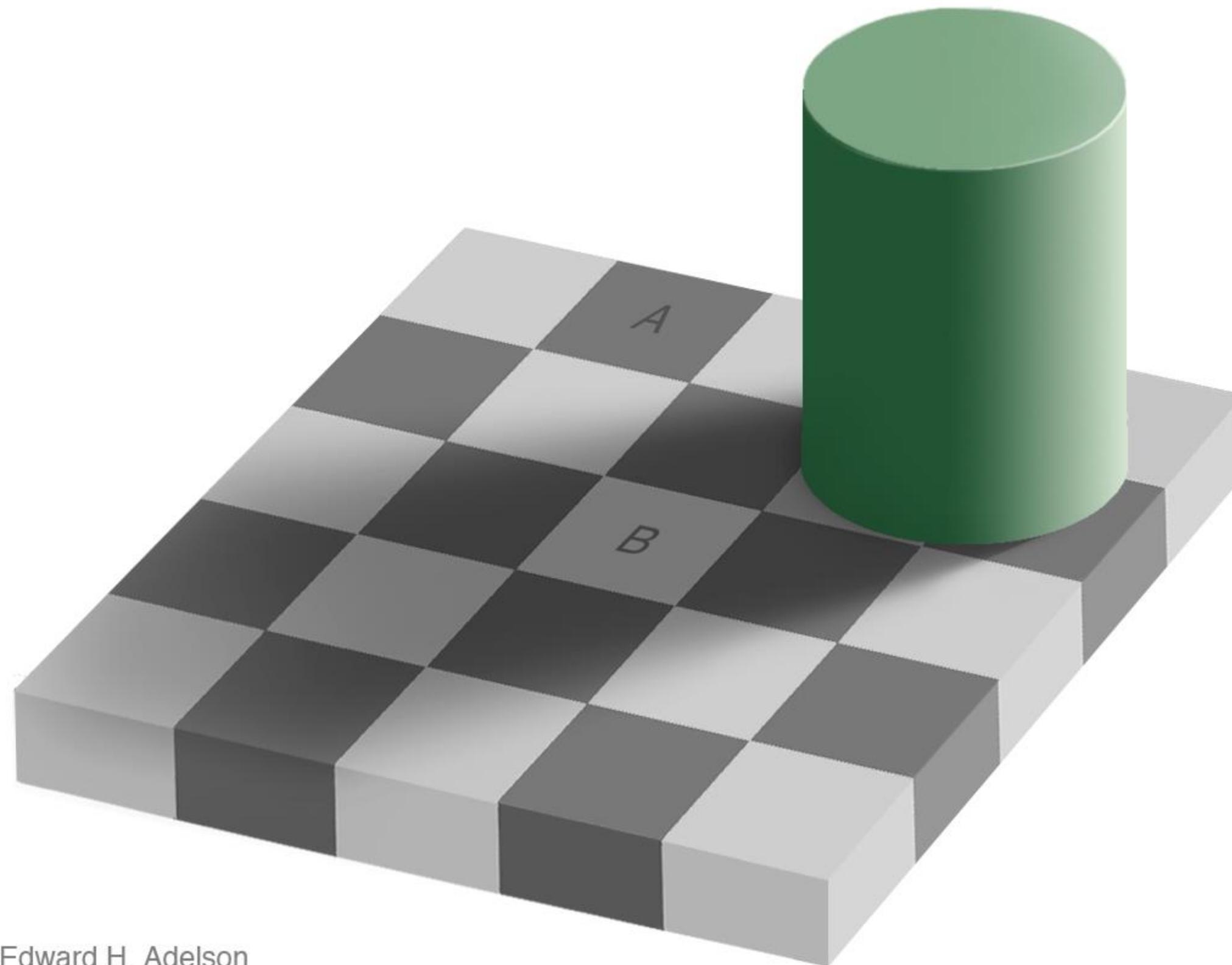


What the machine gets

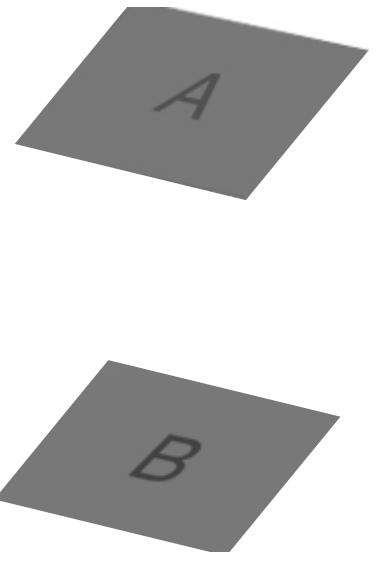
$I =$	160 175 171 168 168 172 164 158 167 173 167 163 162 164 160 159 163 162
	149 164 172 175 178 179 176 118 97 168 175 171 169 175 176 177 165 152
	161 166 182 171 170 177 175 116 109 169 177 173 168 175 175 159 153 123
	171 174 177 175 167 161 157 138 103 112 157 164 159 160 165 169 148 144
	163 163 162 165 167 164 178 167 77 55 134 170 167 162 164 175 168 160
	173 164 158 165 180 180 150 89 61 34 137 186 186 182 175 165 160 164
	152 155 146 147 169 180 163 51 24 32 119 163 175 182 181 162 148 153
	134 135 147 149 150 147 148 62 36 46 114 157 163 167 169 163 146 147
	135 132 131 125 115 129 132 74 54 41 104 156 152 156 164 156 141 144
	151 155 151 145 144 149 143 71 31 29 129 164 157 155 159 158 156 148
	172 174 178 177 177 181 174 54 21 29 136 190 180 179 176 184 187 182
	177 178 176 173 174 180 150 27 101 94 74 189 188 186 183 186 188 187
	160 160 163 163 161 167 100 45 169 166 59 136 184 176 175 177 185 186
	147 150 153 155 160 155 56 111 182 180 104 84 168 172 171 164 168 167
	184 182 178 175 179 133 86 191 201 204 191 79 172 220 217 205 209 200
	184 187 192 182 124 32 109 168 171 167 163 51 105 203 209 203 210 205
	191 198 203 197 175 149 169 189 190 173 160 145 156 202 199 201 205 202
	153 149 153 155 173 182 179 177 182 177 182 185 179 177 167 176 182 180

The camera is a measurement device, not a vision system

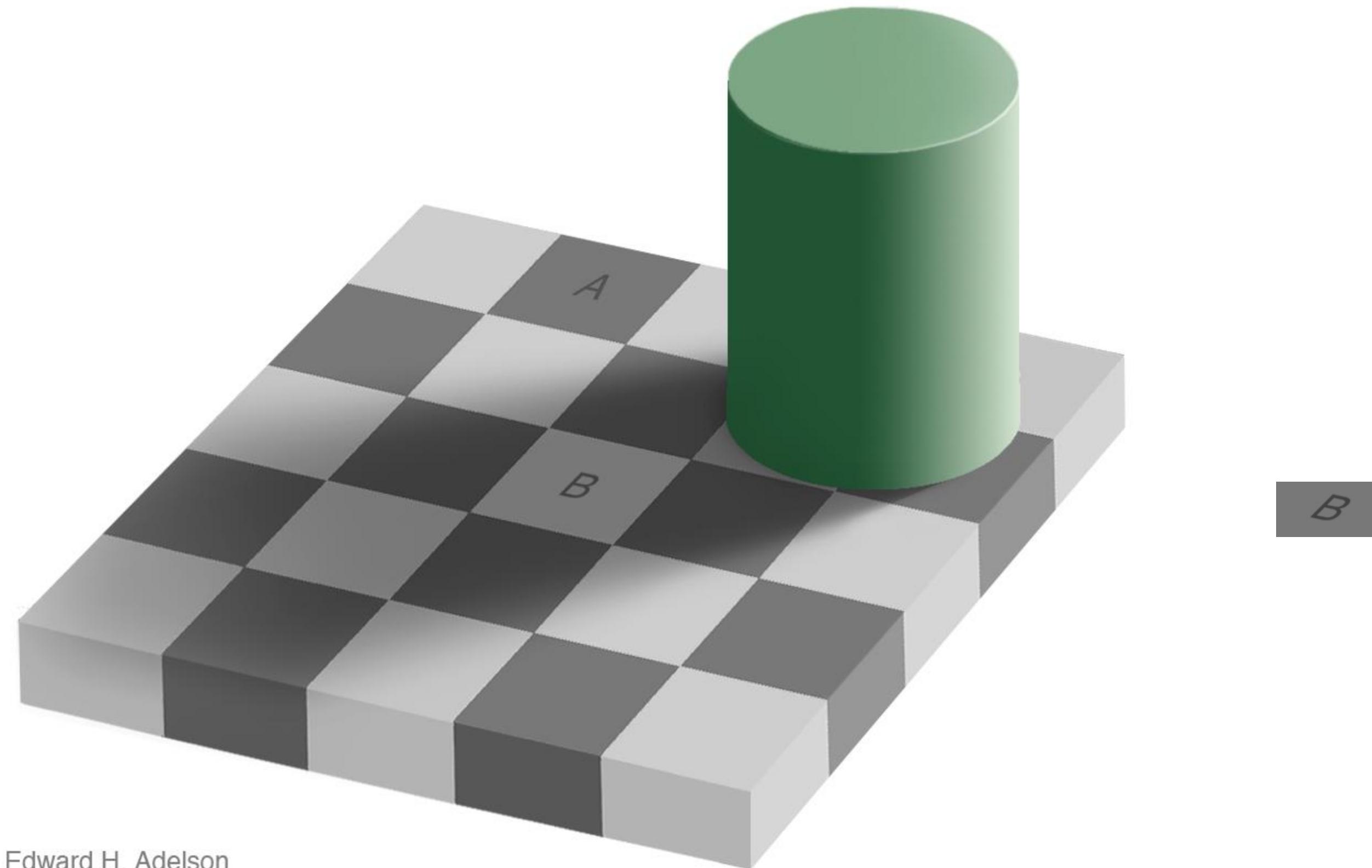
# To see: perception vs. measurement



# To see: perception vs. measurement

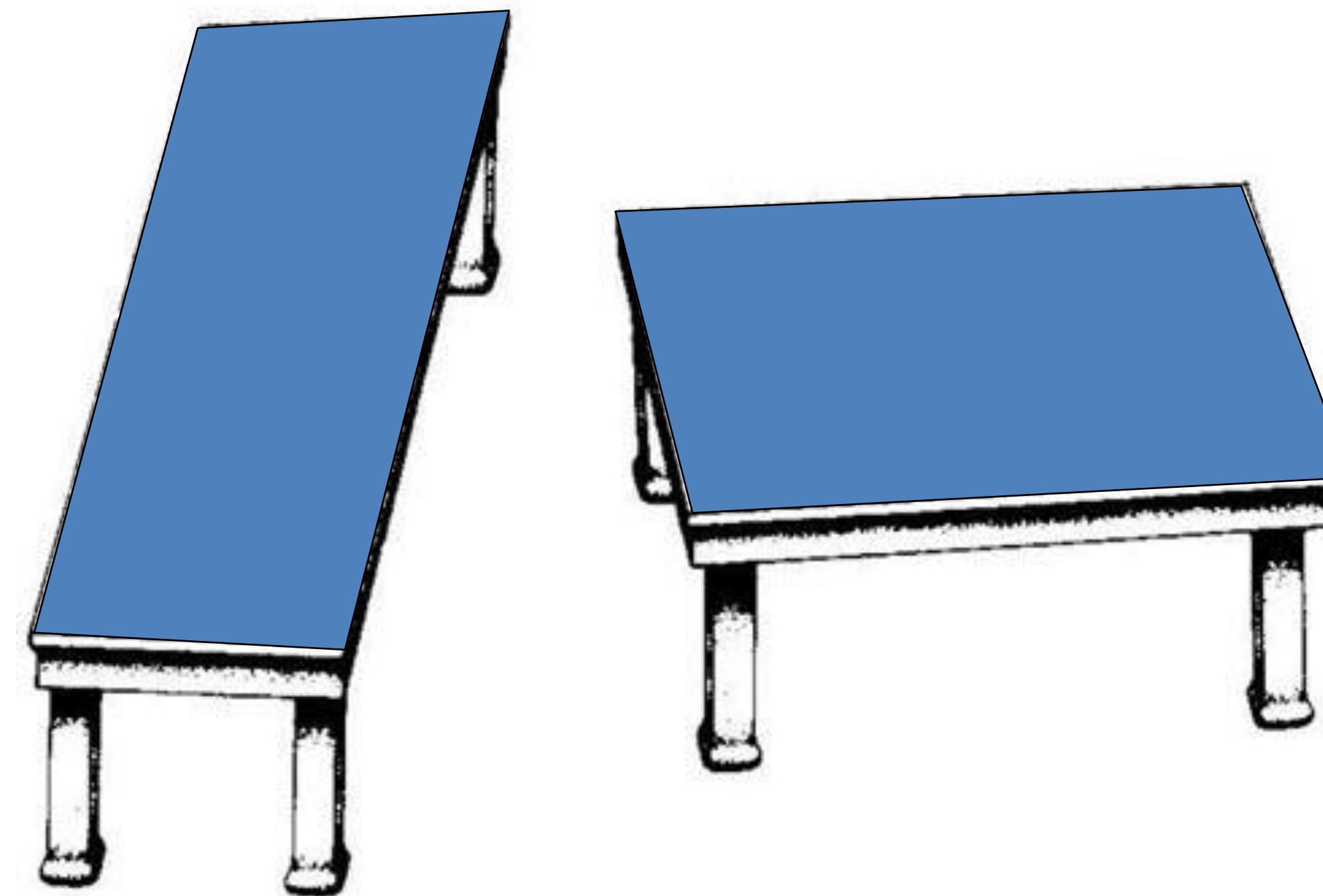


# To see: perception vs. measurement



# To see: perception vs. measurement

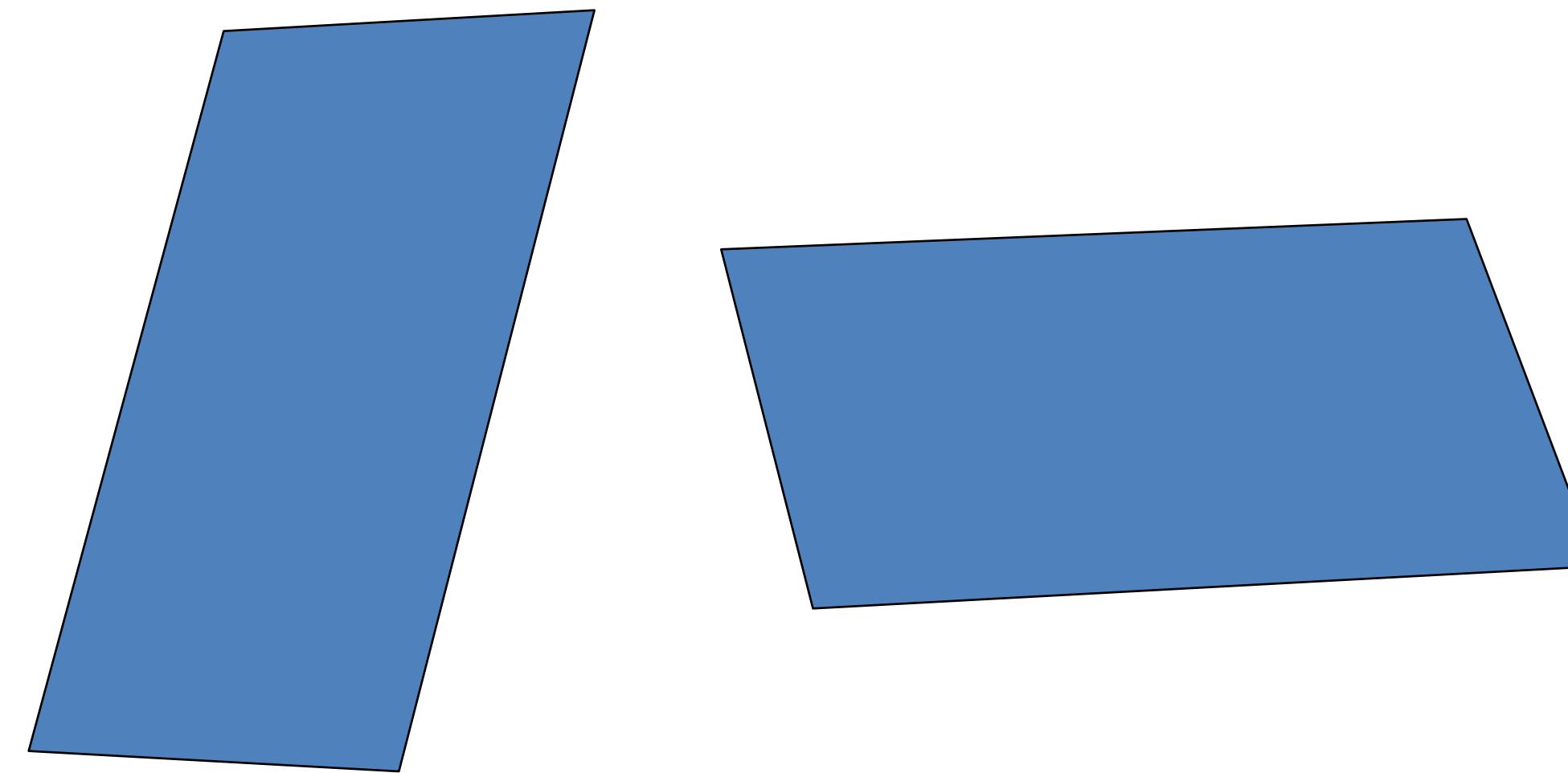
Depth processing is automatic, and we can not shut it down...



by Roger Shepard ("Turning the Tables")

# To see: perception vs. measurement

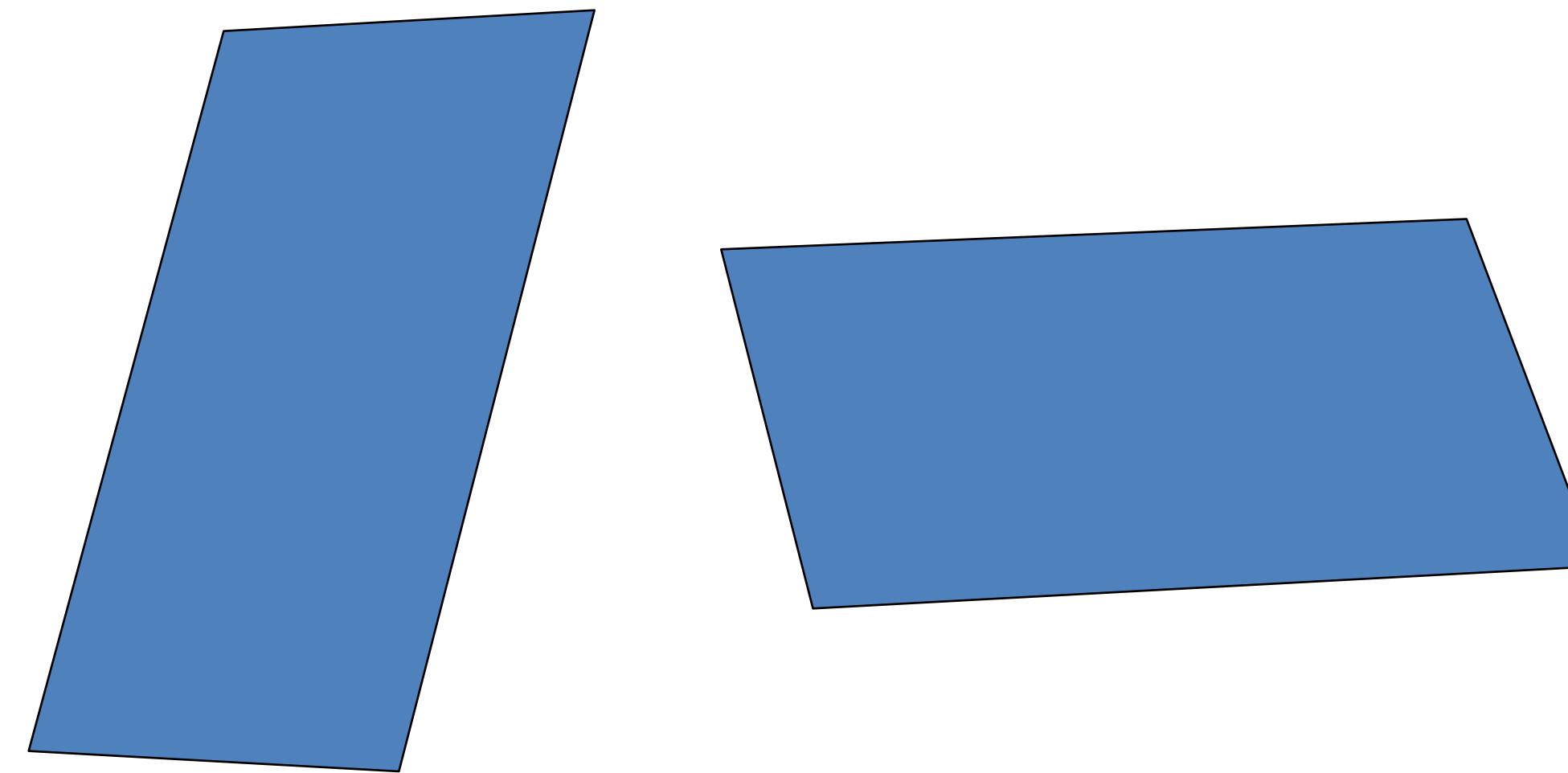
Depth processing is automatic, and we can not shut it down...



by Roger Shepard ("Turning the Tables")

# To see: perception vs. measurement

Depth processing is automatic, and we can not shut it down...



by Roger Shepard ("Turning the Tables")









# A Simple Vision System

The goal of this lecture is to embrace the optimism of the 60s and to hand-design an end-to-end vision system.

# A Simple Visual System

- A simple world
- A simple goal
- A simple image formation model

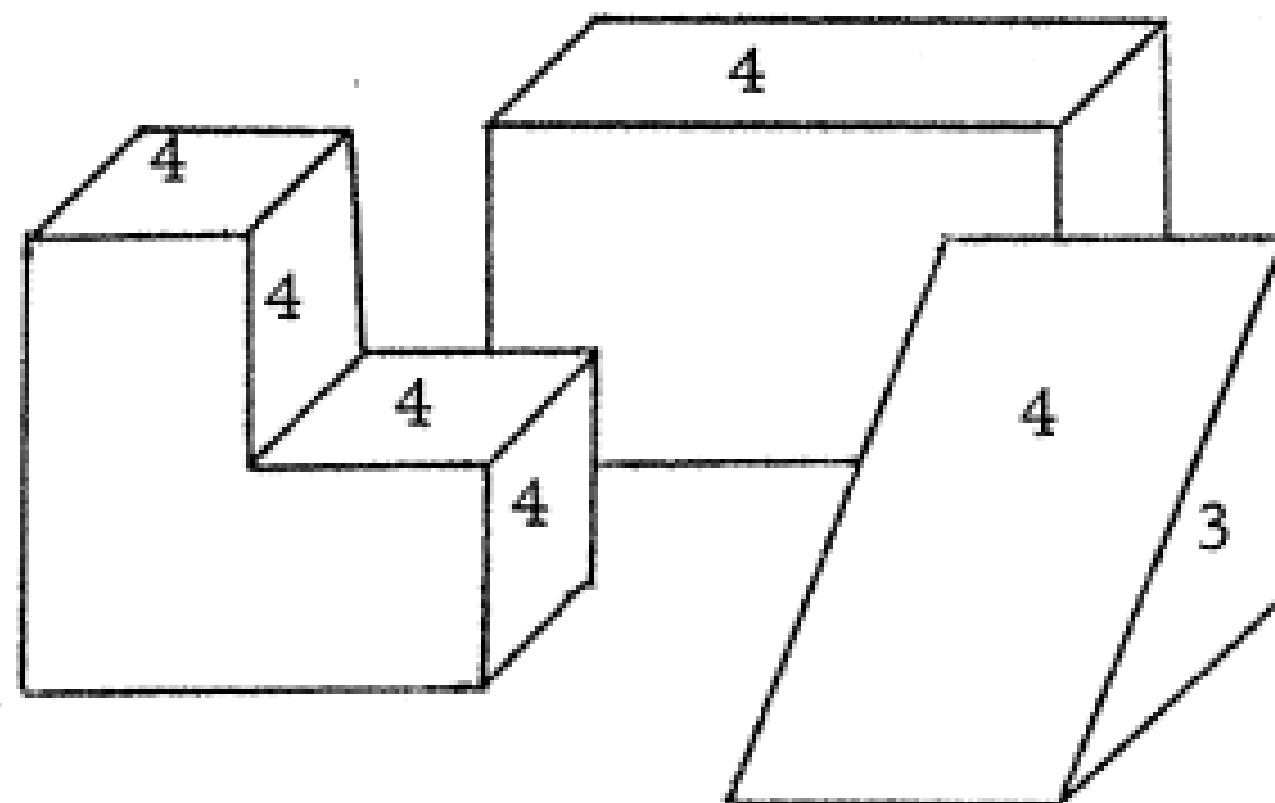
# A Simple World

MACHINE PERCEPTION OF THREE-DIMENSIONAL SOLIDS

by

LAWRENCE GILMAN ROBERTS

Submitted to the Department of Electrical Engineering  
on May 10, 1963, in partial fulfillment of the require-  
ments for the degree of Doctor of Philosophy.



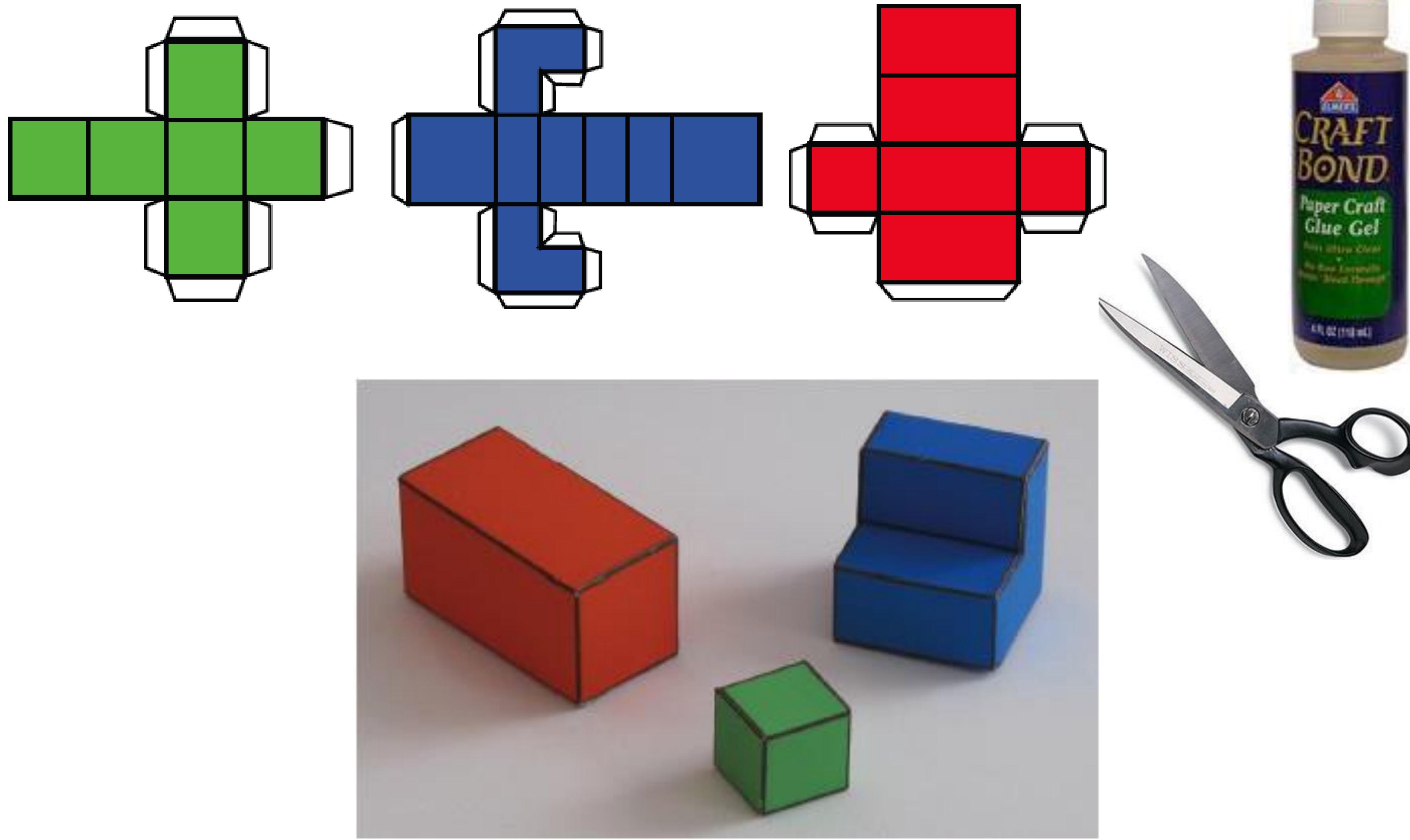
Complete Convex Polygons. The polygon selection procedure would select the numbered polygons as complete and convex. The number indicates the probable number of sides. A polygon is incomplete if one of its points is a collinear joint of another polygon.

The problem of machine recognition of pictorial data has long been a challenging goal, but has seldom been attempted with anything more complex than alphabetic characters. Many people have felt that research on character recognition would be a first step, leading the way to a more general pattern recognition system. However, the multitudinous attempts at character recognition, including my own, have not led very far. The reason, I feel, is that the study of abstract, two-dimensional forms leads us away from, not toward, the techniques necessary for the recognition of three-dimensional objects.

*Probably the first computer vision PhD*

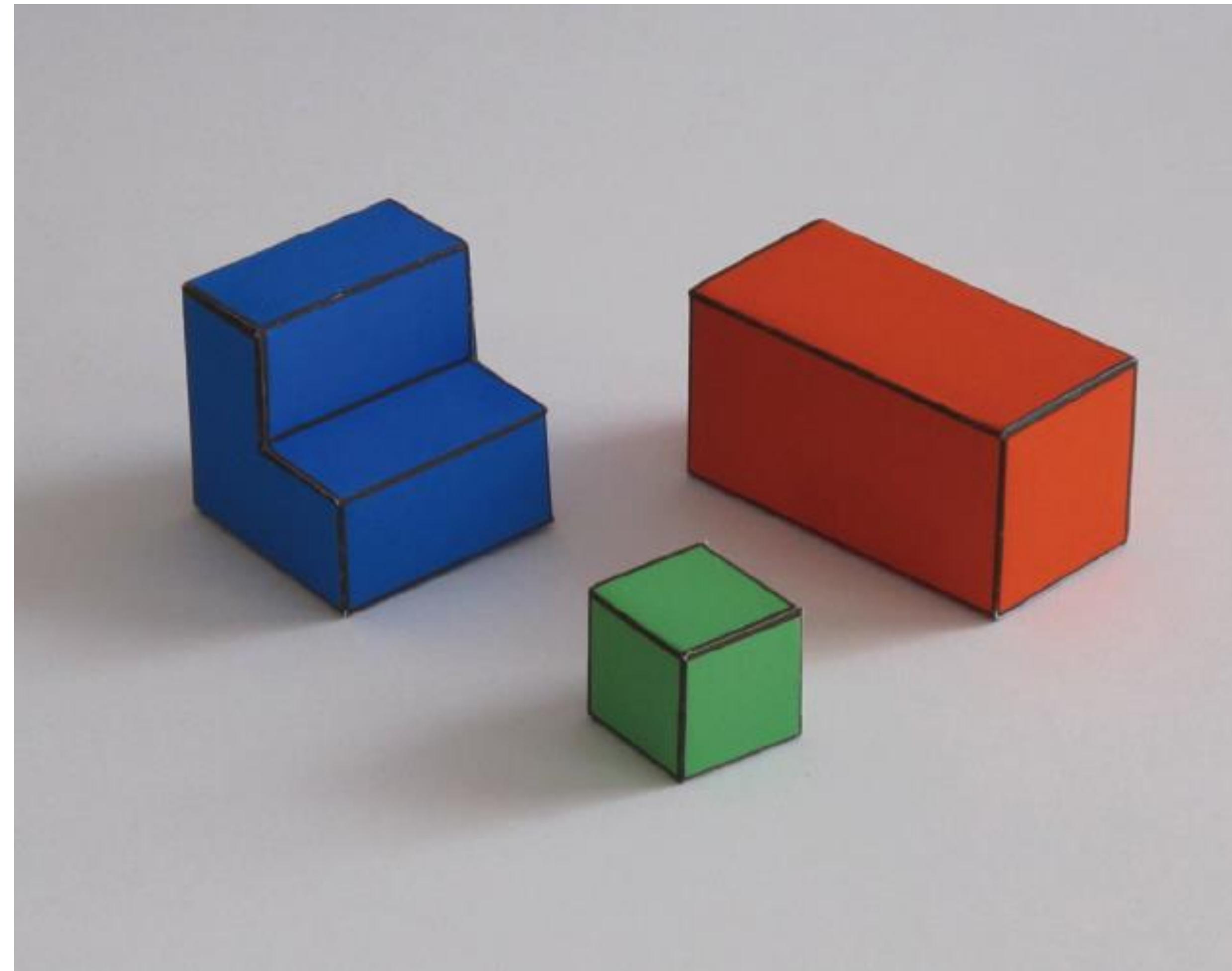
Lawrence Roberts ("Machine Perception of Three Dimensional Solids," 1963)

# Build your own simple world



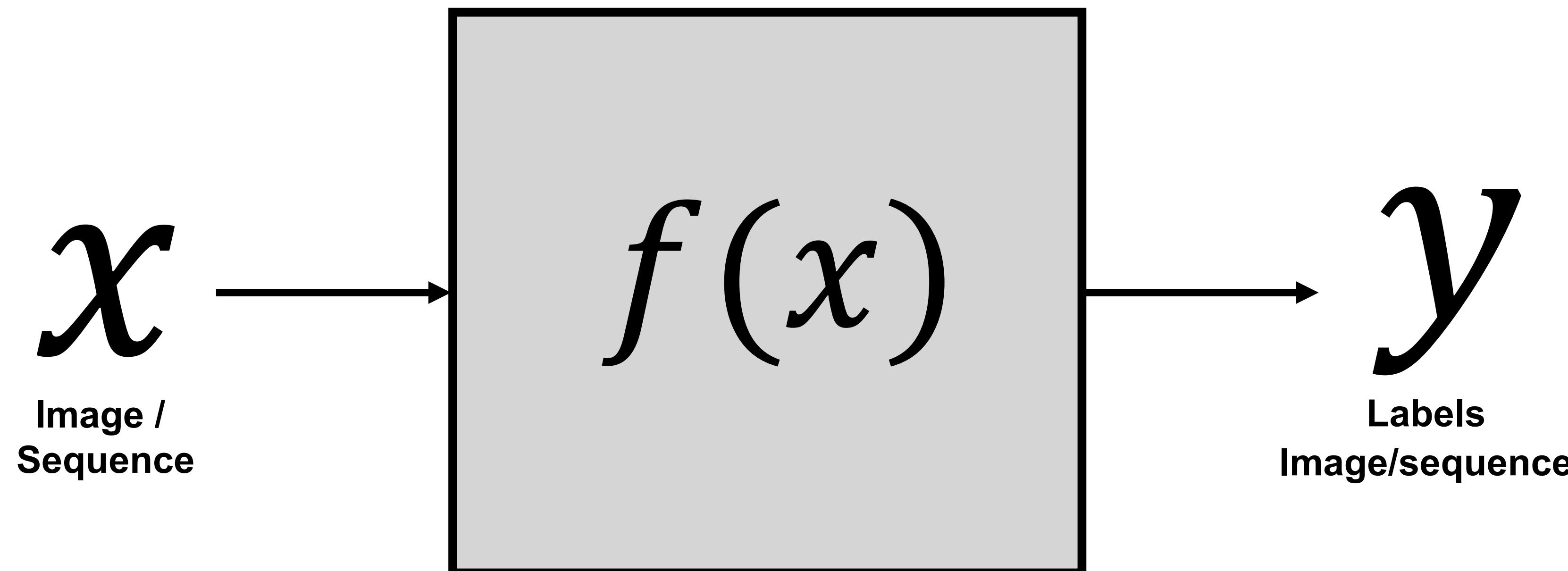
# A simple goal

To recover the 3D structure of the world from the 2D image

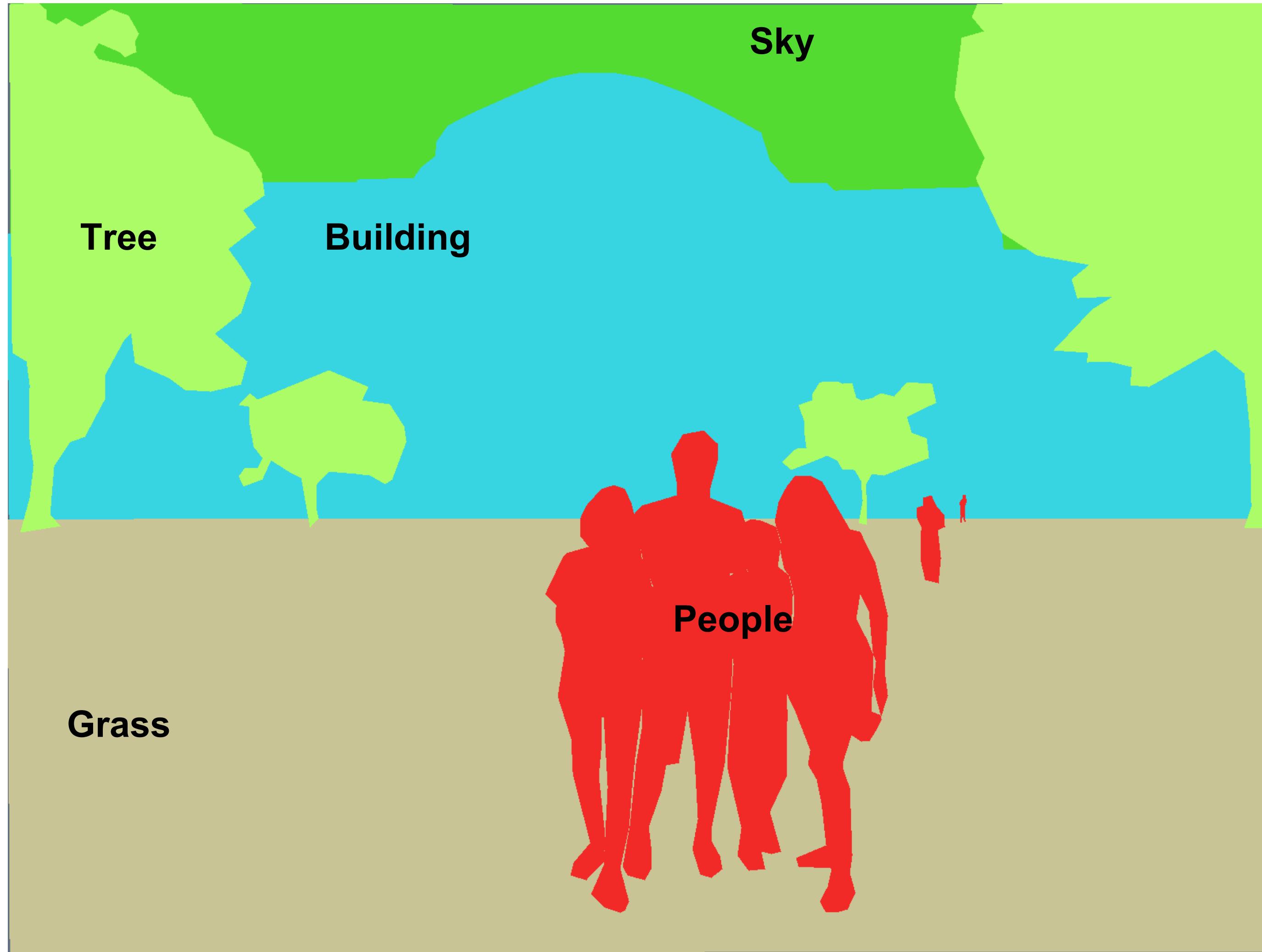


We will make this goal more explicit later.

# Tasks: generic formulation



# Tasks: what humans care about

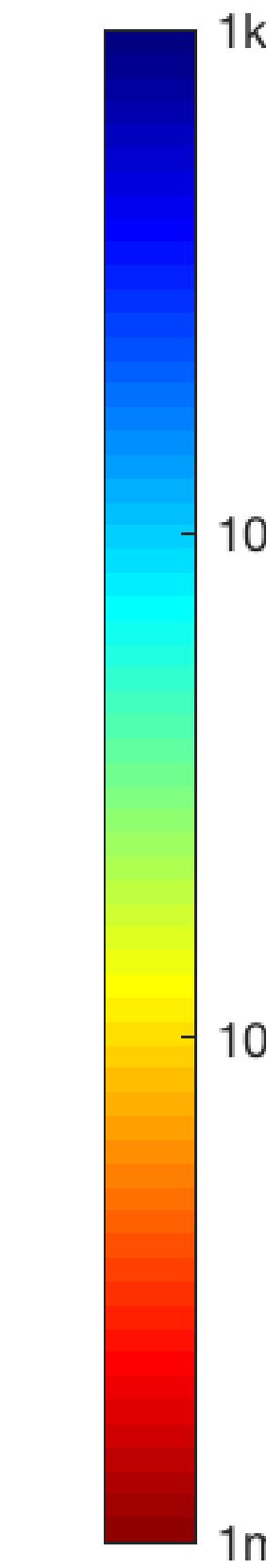
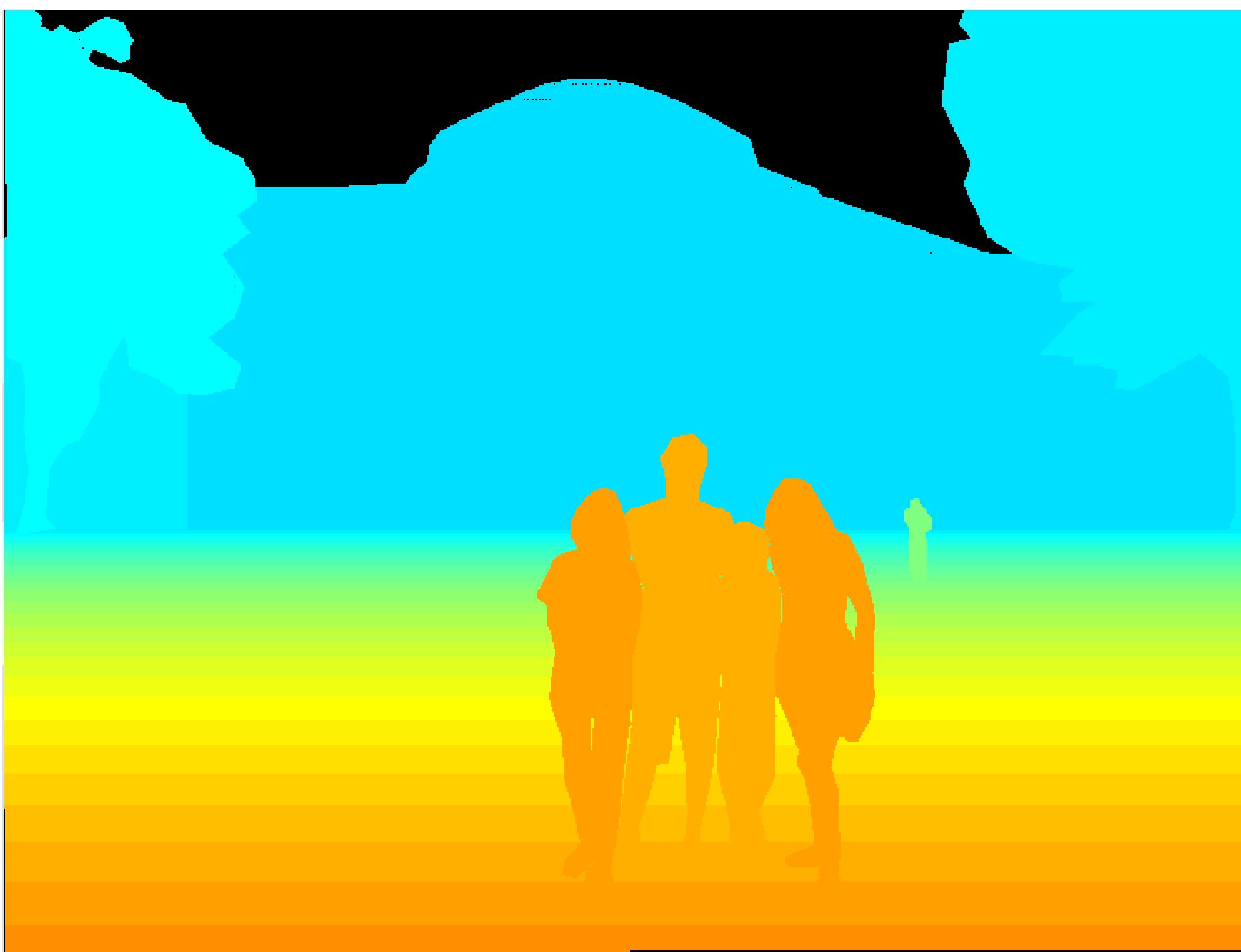


**Semantic segmentation:**  
Assign labels to all the pixels in the image

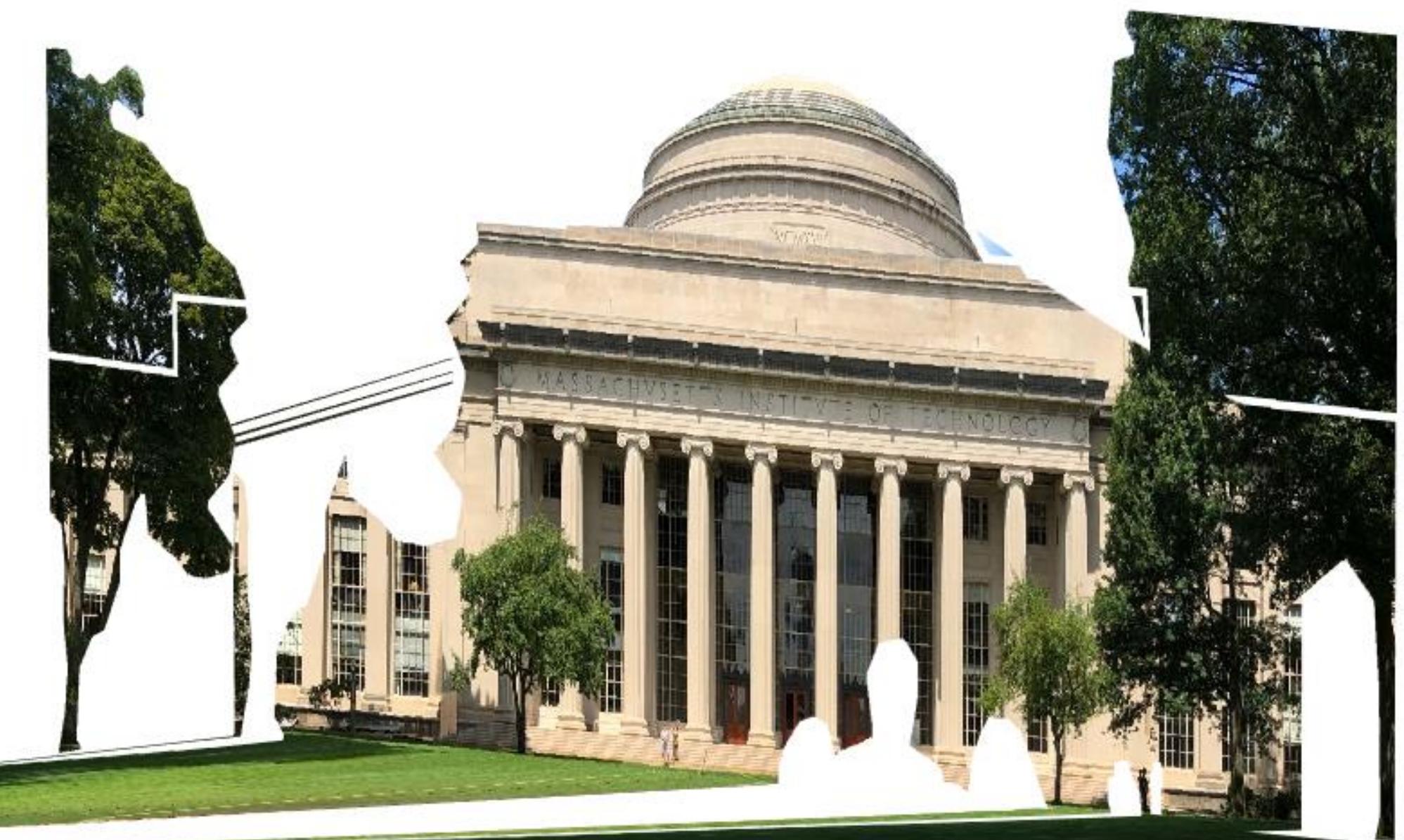
## Related tasks:

- Semantic segmentation
- Object categorization
- Face detection and recognition
- Human body pose
- ...

# Tasks: what humans care about



3D reconstruction



# Tasks: what humans care about

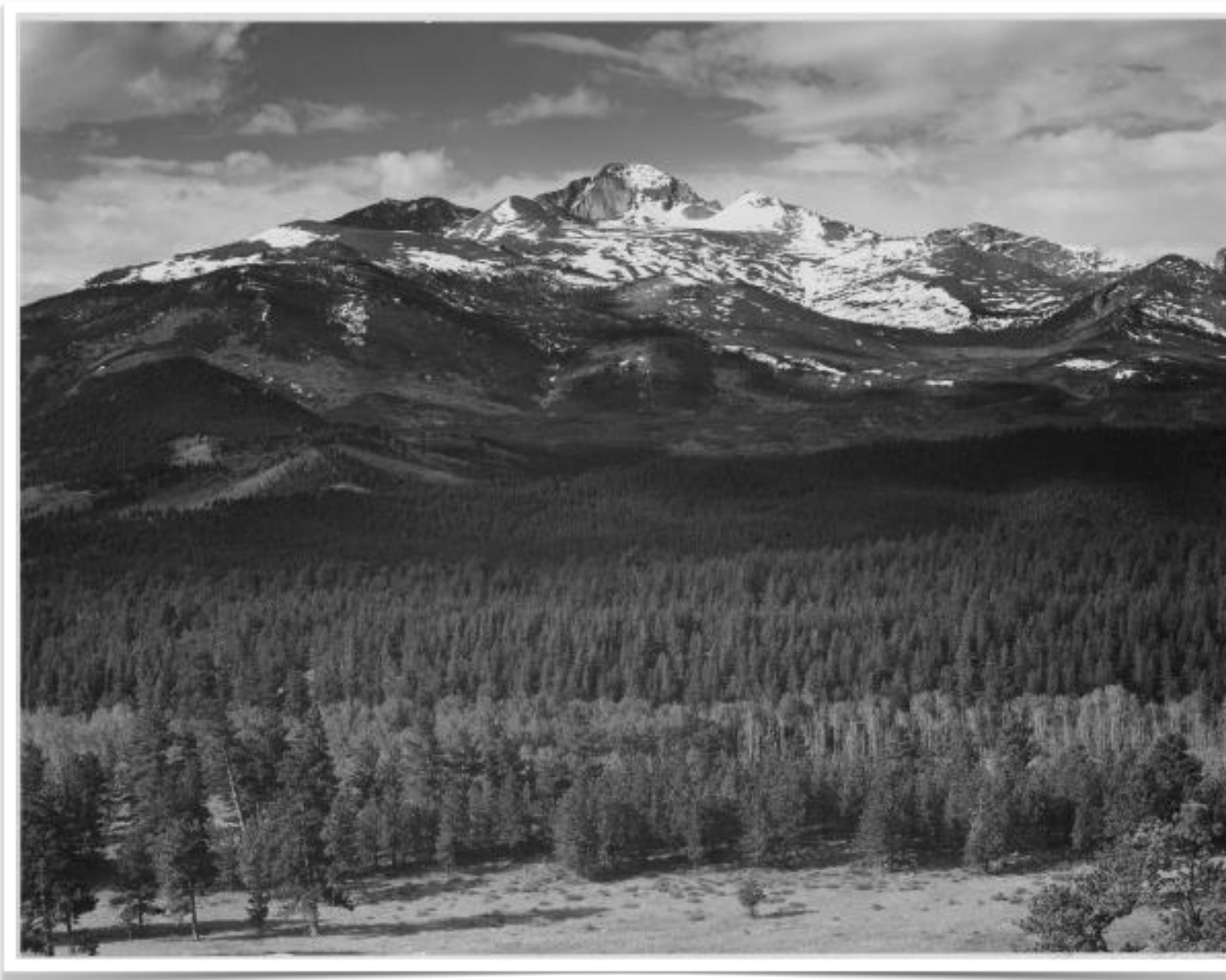


Making new images

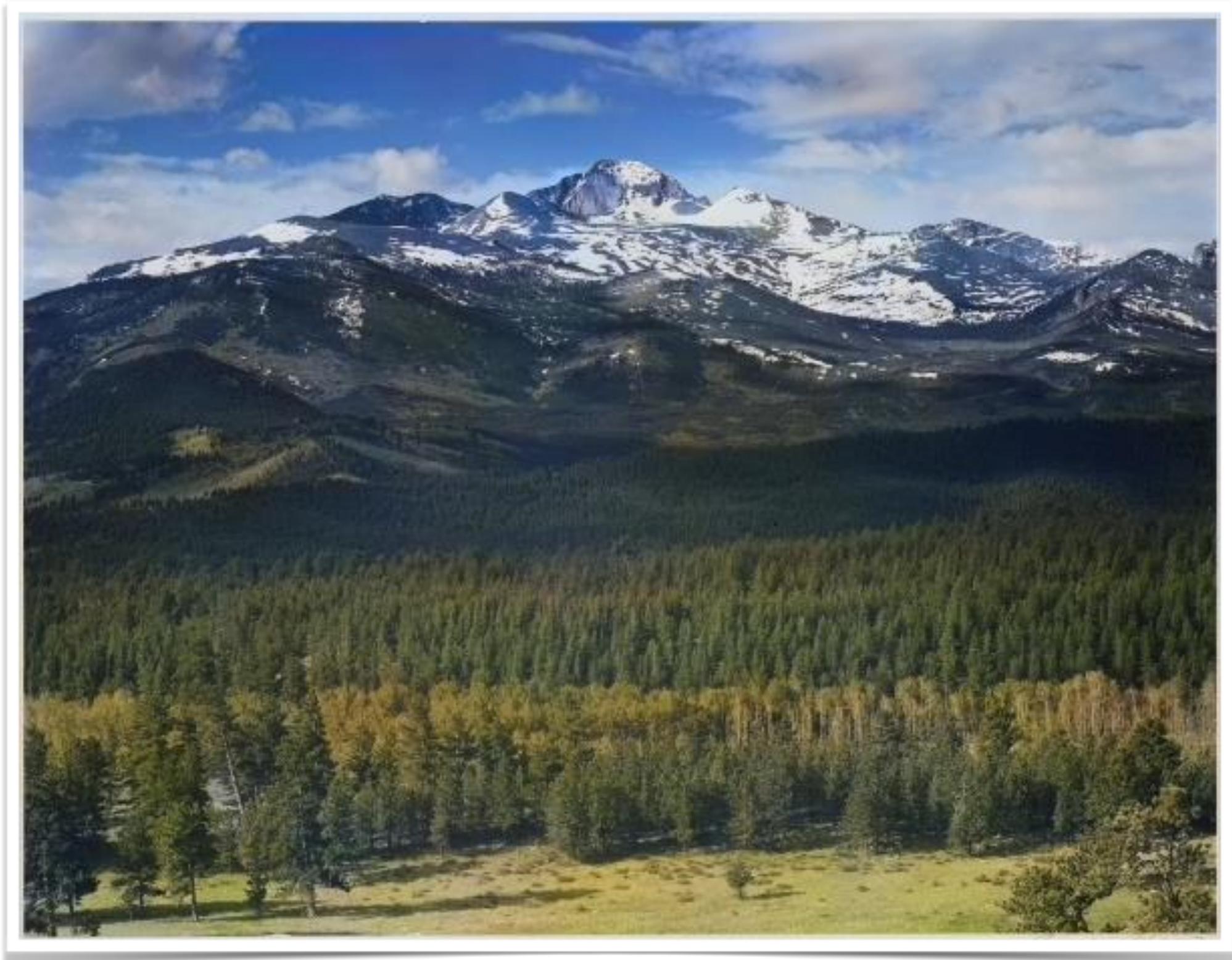
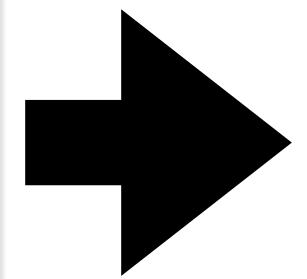
[https://www.reddit.com/r/dalle2/comments/y4mygn/a\\_cup\\_of\\_cat/](https://www.reddit.com/r/dalle2/comments/y4mygn/a_cup_of_cat/)

# Tasks: what humans care about

Adding missing content



Input image

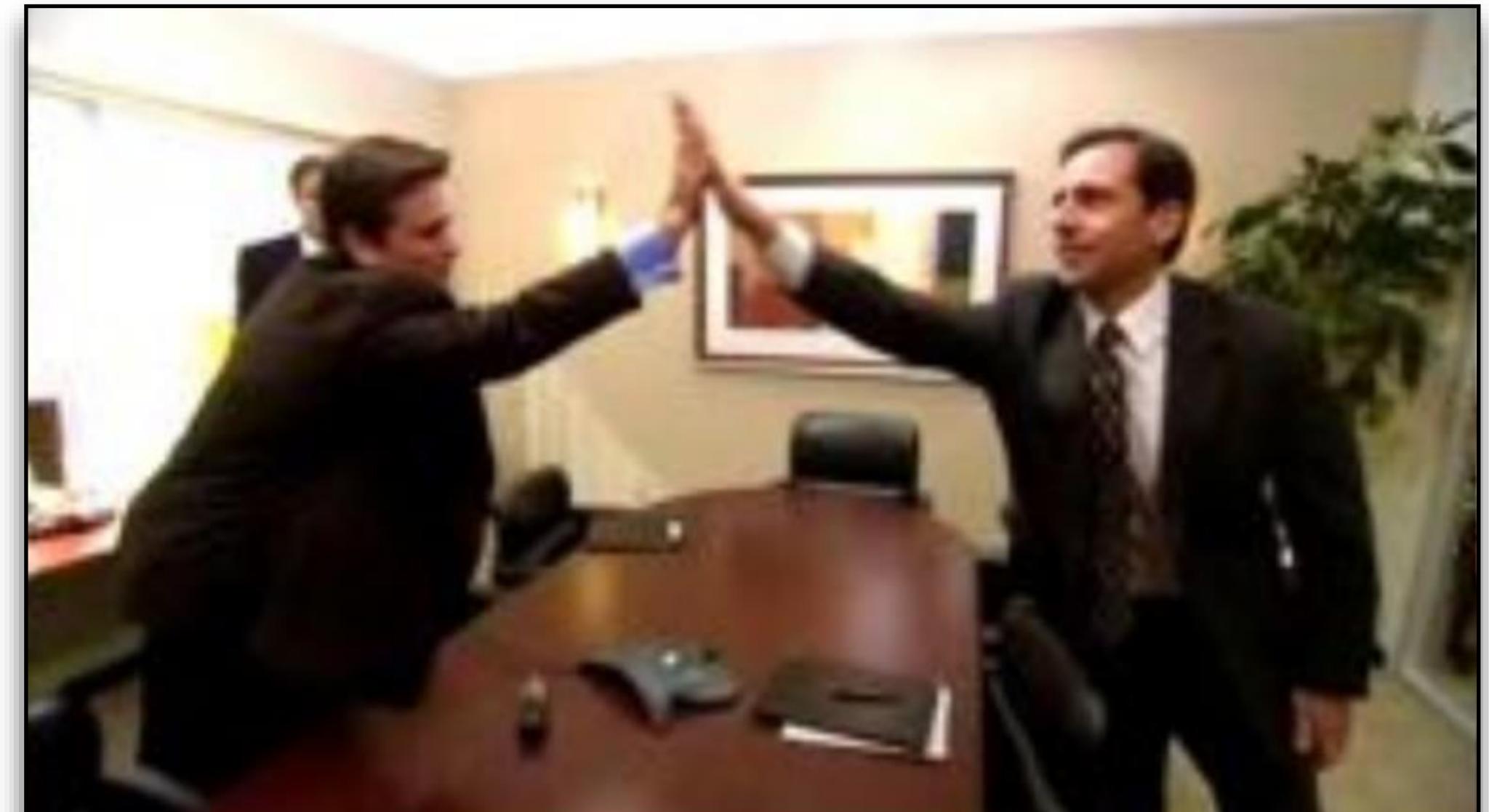
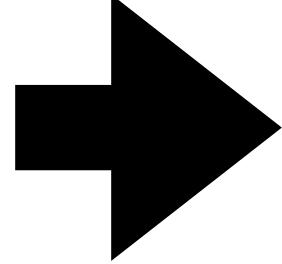


Colorized output

<https://richzhang.github.io/colorization/>

# Tasks: what humans care about

## Predicting future events



What is going to happen?

<https://hyperfuture.cs.columbia.edu/>