

# galvanEye

A remote control car that drives itself using OpenCV and neural networks

by Paul Yim  
galvanize DSI, August 2016 cohort  
Austin, TX



# Motivation

The New York Times, Sep 10, 2016

TECHNOLOGY

## No Driver? Bring It On. How Pittsburgh Became Uber's Testing Ground

By CECILIA KANG SEPT. 10, 2016



Uber cars prepare to roll through Pittsburgh to map out the roads and topography before the introduction of the company's driverless vehicles. Jeff Swensen for The New York Times

PITTSBURGH — Any day now, Uber will introduce a [fleet of self-driving cars in Pittsburgh](#), making this former steel town the world's first city to let

- Autonomous vehicles are now on the road.
- Major implications for public policy.
- How do they work?

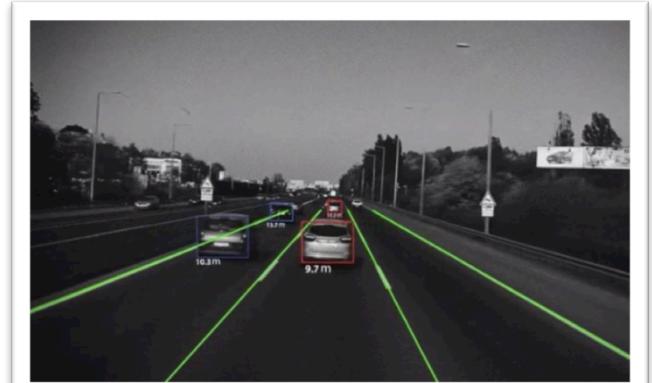
# Motivation

Variety of systems, often working in concert:

- Radar and Lidar
- Motion sensors
- Computer vision
  - **Image processing**
  - **Neural network prediction**

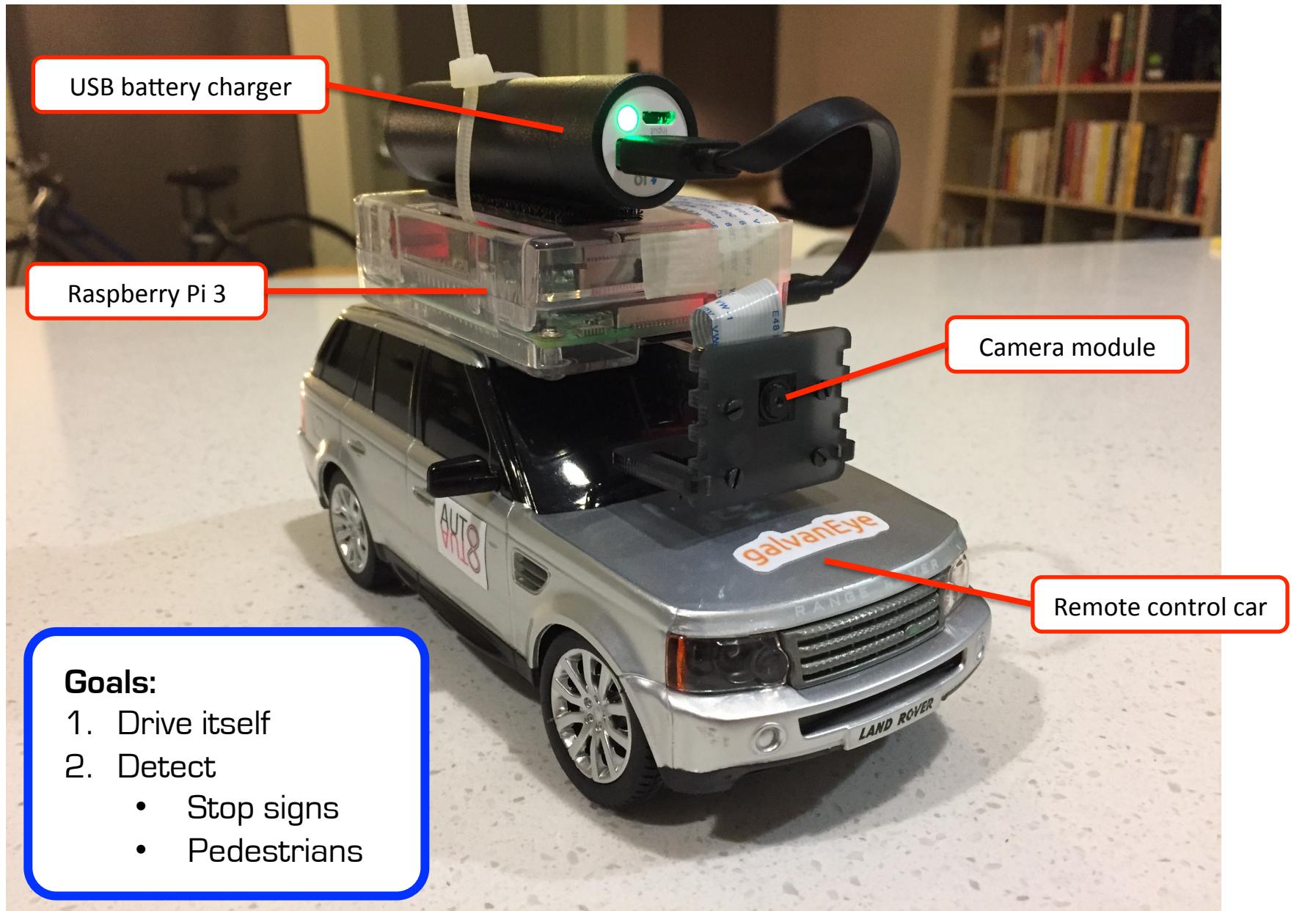


Google

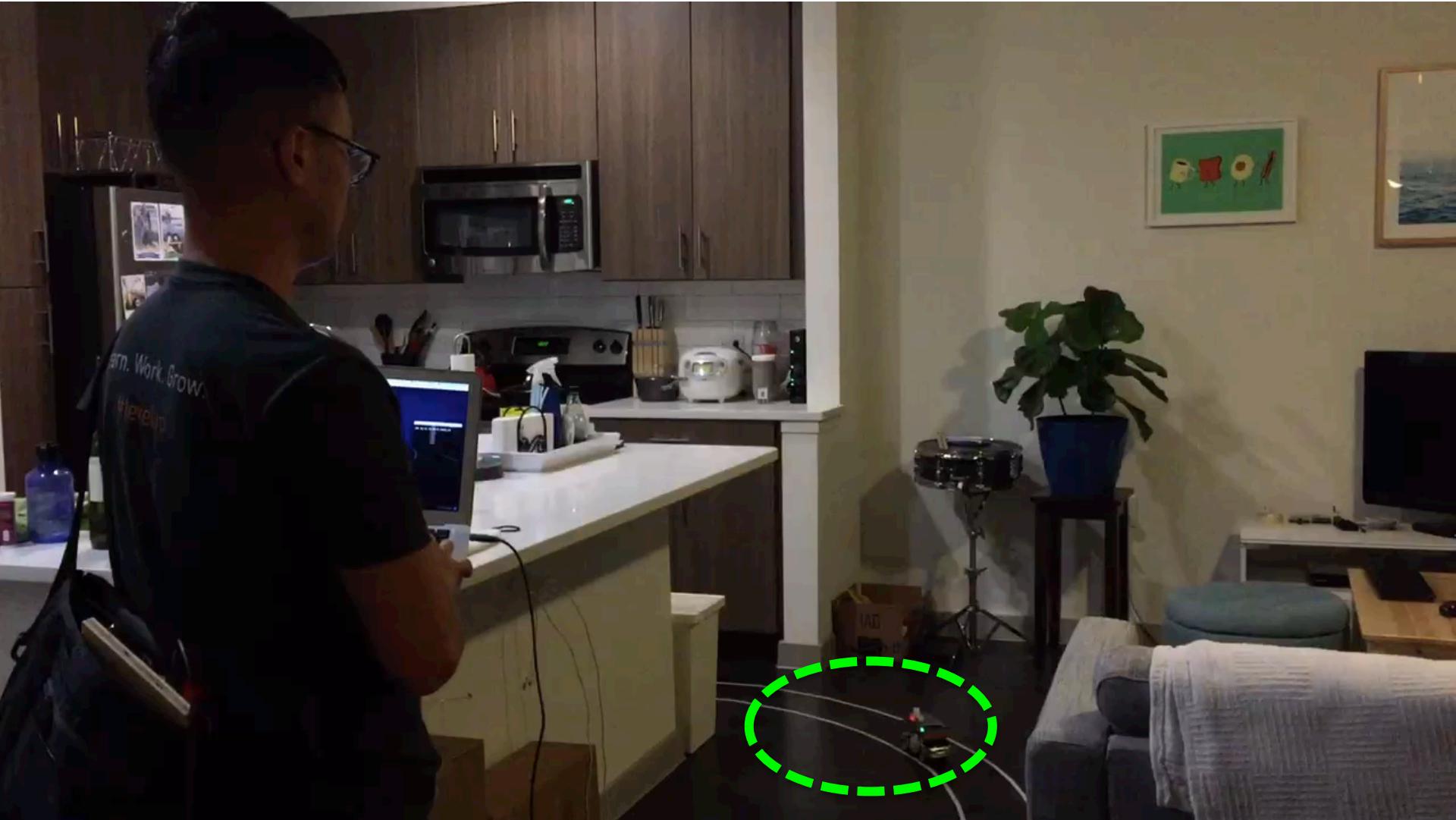


Mobileye

# Model



## Model: Training data

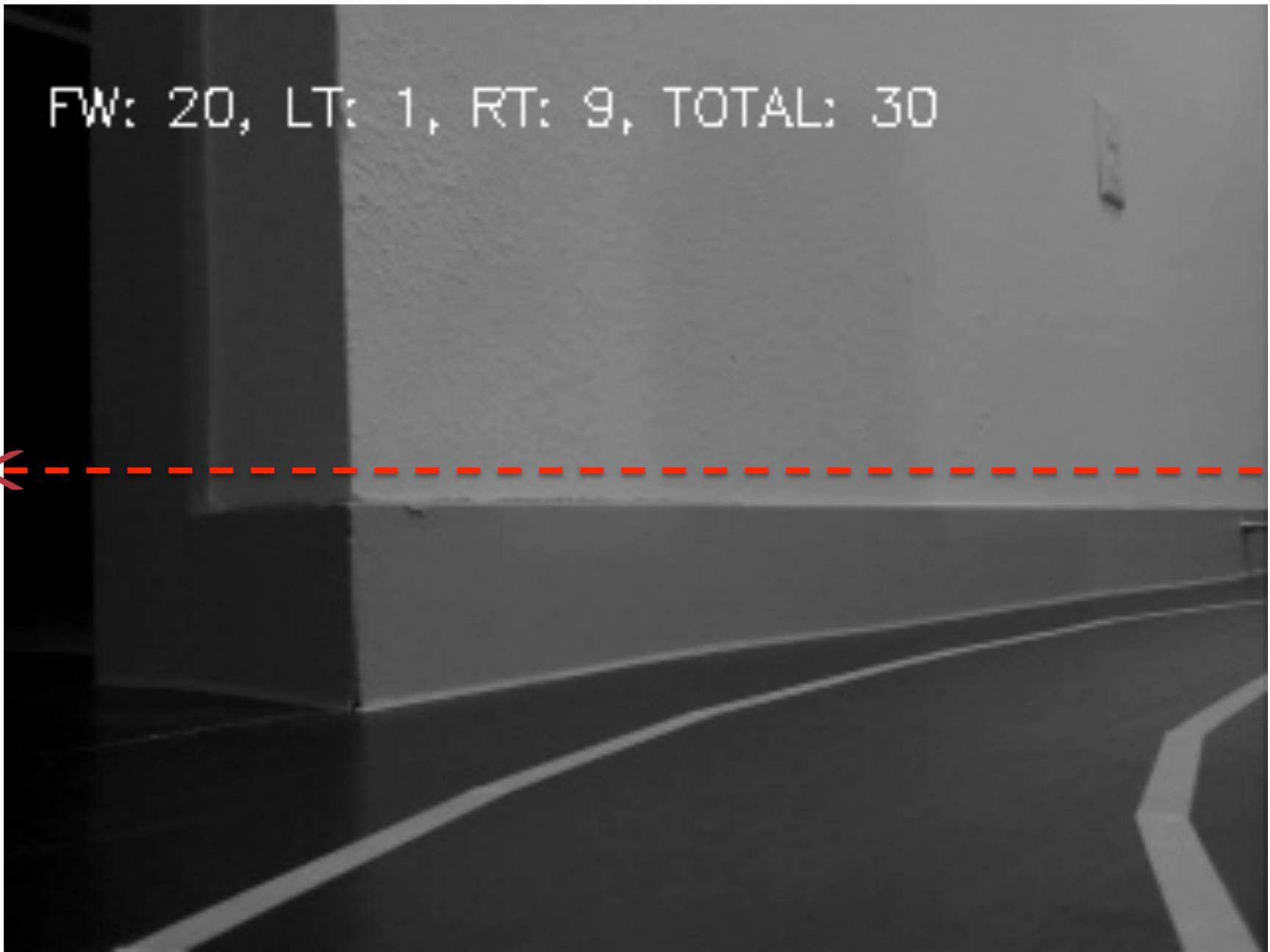


Model: Training data



Model: Training

FW: 20, LT: 1, RT: 9, TOTAL: 30



## Model: Training

“LEFT”	[ 1 , 0 , 0 ]
“RIGHT”	[ 0 , 1 , 0 ]
“FORWARD”	[ 0 , 0 , 1 ]

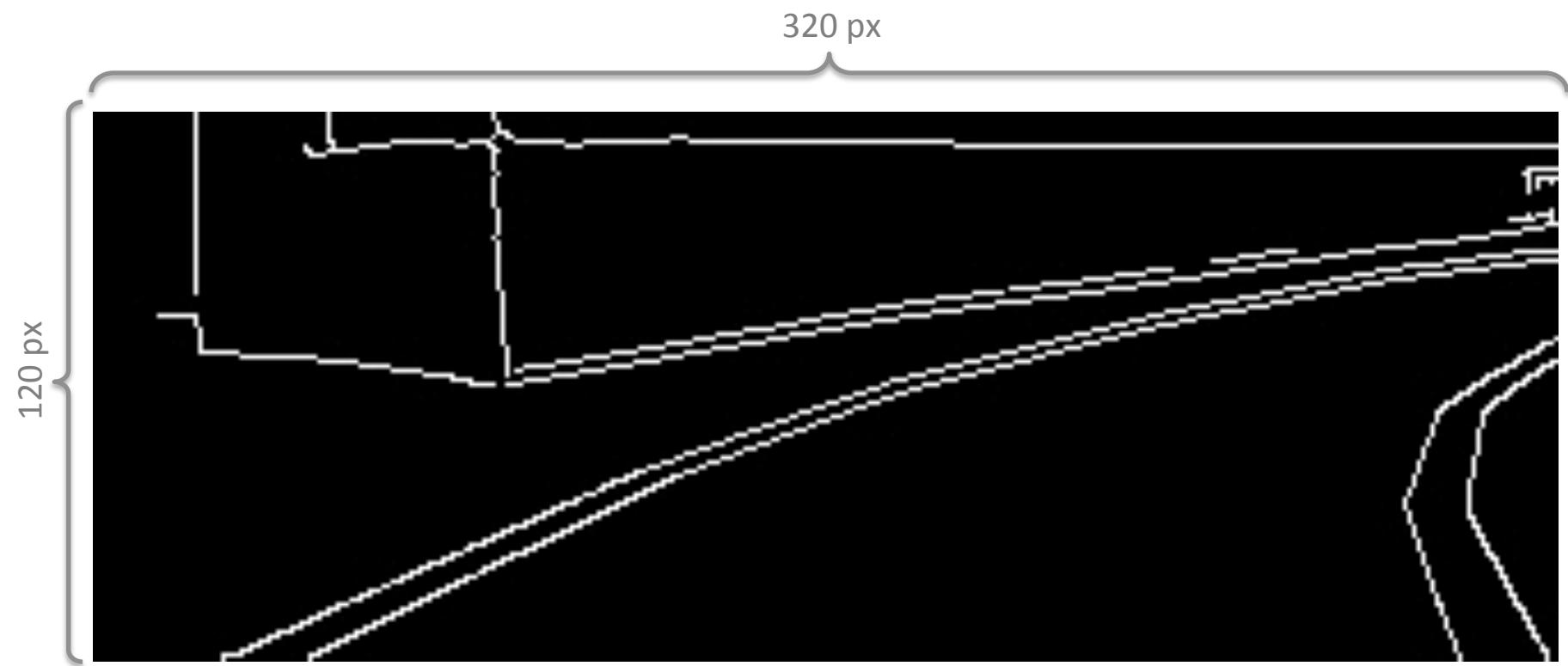
Given this image as input, the correct output is to turn “RIGHT”.



## Model: Training

“RIGHT” [ 0 , 1 , 0 ]

Given this image as input, the correct output is to turn “RIGHT”.



## Model: Training

“RIGHT” [ 0 , 1 , 0 ]

Given this image as input, the correct output is to turn “RIGHT”.



## Model: Training

"RIGHT" [ 0, 1, 0 ]

*[not drawn to scale]*

```
[[255, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
 [255, 0, 255, 0, 0, 0, 0, 255, 255, 255, 255, 255],  
 [255, 0, 255, 0, 255, 255, 255, 0, 0, 0, 0, 0],  
 [255, 255, 255, 255, 0, 0, 0, 0, 0, 0, 255, 255],  
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 [0, 0, 0, 0, 255, 0, 0, 0, 0, 0, 255],  
 [0, 0, 0, 255, 0, 0, 0, 0, 0, 0, 255],  
 [0, 0, 255, 0, 0, 0, 0, 0, 0, 0, 255],  
 [0, 255, 0, 0, 0, 0, 0, 0, 0, 255, 0],  
 [255, 0, 0, 0, 0, 0, 0, 0, 0, 255, 0]]
```

## Model: Training

"RIGHT" [ 0, 1, 0 ]

$$120 \times 320 = 38,400$$

*[not drawn to scale]*

320 px

120 px

```
[[255, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
 [255, 0, 255, 0, 0, 0, 0, 255, 255, 255, 255, 255],  
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 [0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 255, 0],  
 [255, 0, 0, 0, 0, 0, 0, 0, 0, 0, 255, 0]]
```

## Model: Training

"RIGHT" [ 0, 1, 0 ]

$$120 \times 320 = 38,400$$

```
[[255, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
[255, 0, 255, 0, 0, 0, 0, 255, 255, 255, 255, 255],  
[255, 0, 255, 0, 255, 255, 255, 0, 0, 0, 0, 0],  
[255, 255, 255, 255, 0, 0, 0, 0, 0, 255, 255],  
[ 0, 0, 0, 0, 0, 0, 0, 255, 255, 0, 0],  
[ 0, 0, 0, 0, 0, 255, 255, 0, 0, 0, 0],  
[ 0, 0, 0, 0, 255, 0, 0, 0, 0, 0, 255],  
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[ 0, 0, 255, 0, 0, 0, 0, 0, 0, 0, 255],  
[ 0, 255, 0, 0, 0, 0, 0, 0, 255, 0],  
[255, 0, 0, 0, 0, 0, 0, 0, 255, 0]]
```

## Model: Training

"RIGHT" [ 0, 1, 0 ]

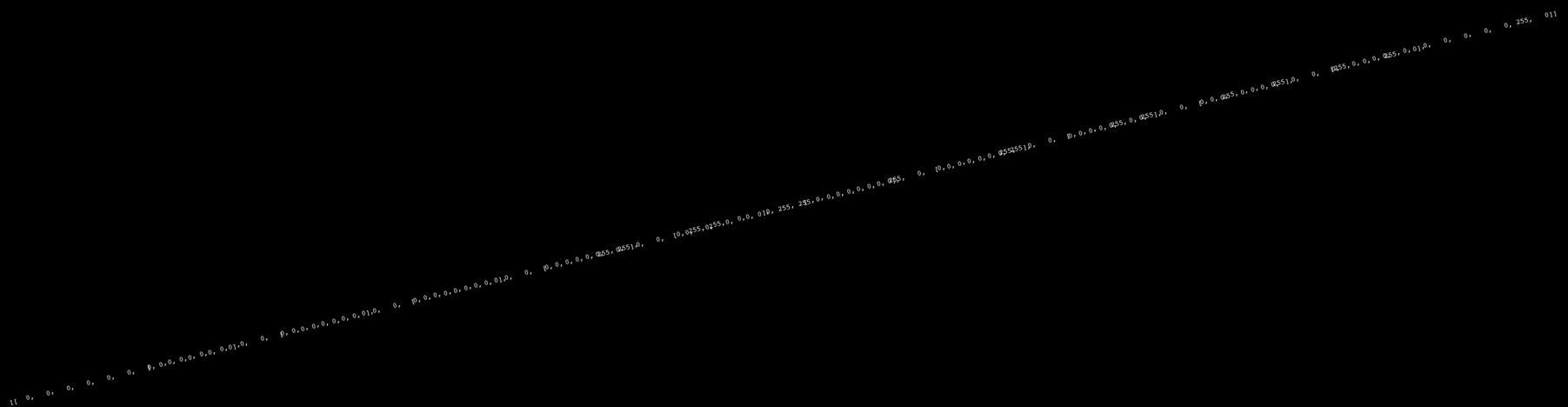
$$120 \times 320 = 38,400$$

```
{[255, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
[255, 0, 255, 0, 0, 0, 0, 0, 255, 255, 255, 255],  
[255, 0, 255, 0, 0, 255, 255, 255, 0, 0, 0, 0],  
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[ 0, 0, 0, 0, 0, 0, 0, 0, 255, 255, 0, 0, 0, 0],  
[ 0, 0, 0, 0, 0, 0, 0, 0, 255, 255, 0, 0, 0, 0],  
[ 0, 0, 0, 0, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0],  
[ 0, 0, 0, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
[ 0, 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
[ 0, 255, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0],  
[255, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0, 0]}]
```



# Model: Training

"RIGHT" [ 0, 1, 0 ]



# Model: Training

"RIGHT" [ 0 , 1 , 0 ]

# Model: Training

"RIGHT" [ 0, 1, 0 ]

# Model: Training

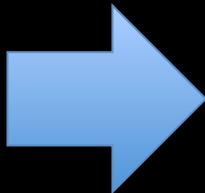
“RIGHT” [ 0 , 1 , 0 ]

# Model: Training

"RIGHT" [ 0 , 1 , 0 ]

# Model: Training

38,400 features



INPUT LAYER  
38,400 nodes

HIDDEN LAYER  
30 nodes

"RIGHT" [ 0 , 1 , 0 ]

OUTPUT LAYER  
3 nodes

[ 1 , 0 , 0 ] "LEFT"

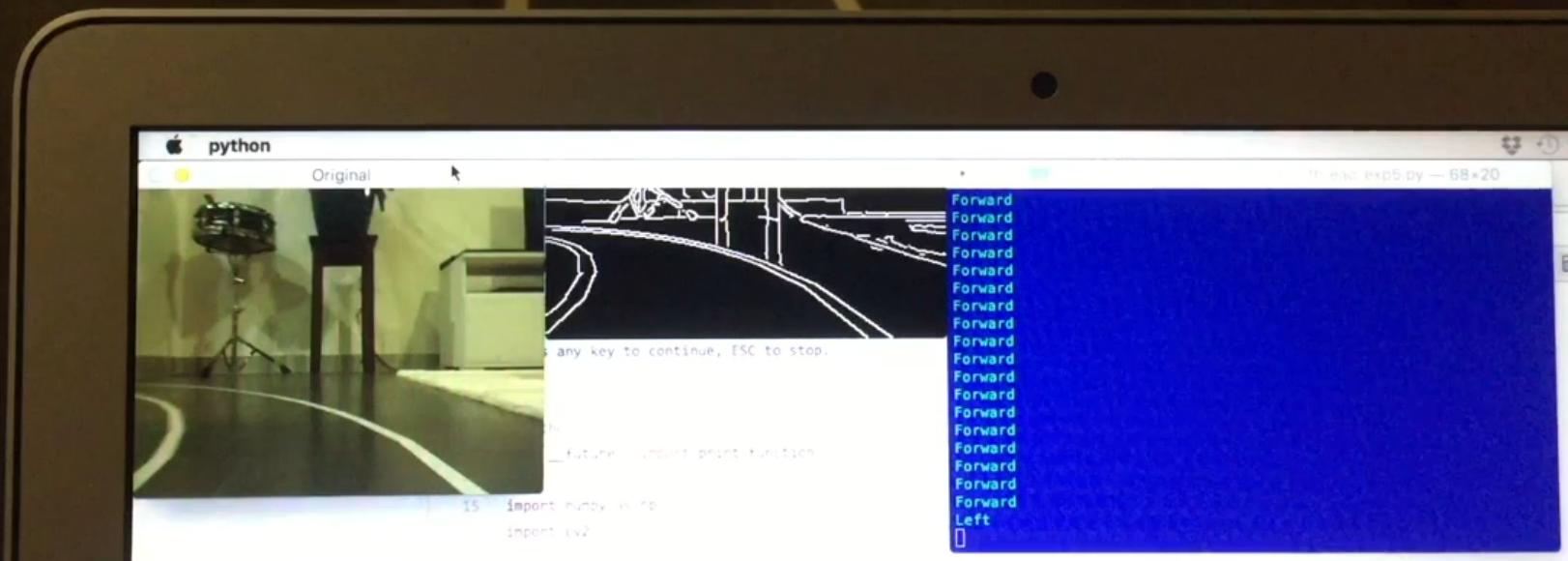
[ 0 , 1 , 0 ] "RIGHT"  

[ 0 , 0 , 1 ] "FORWARD"

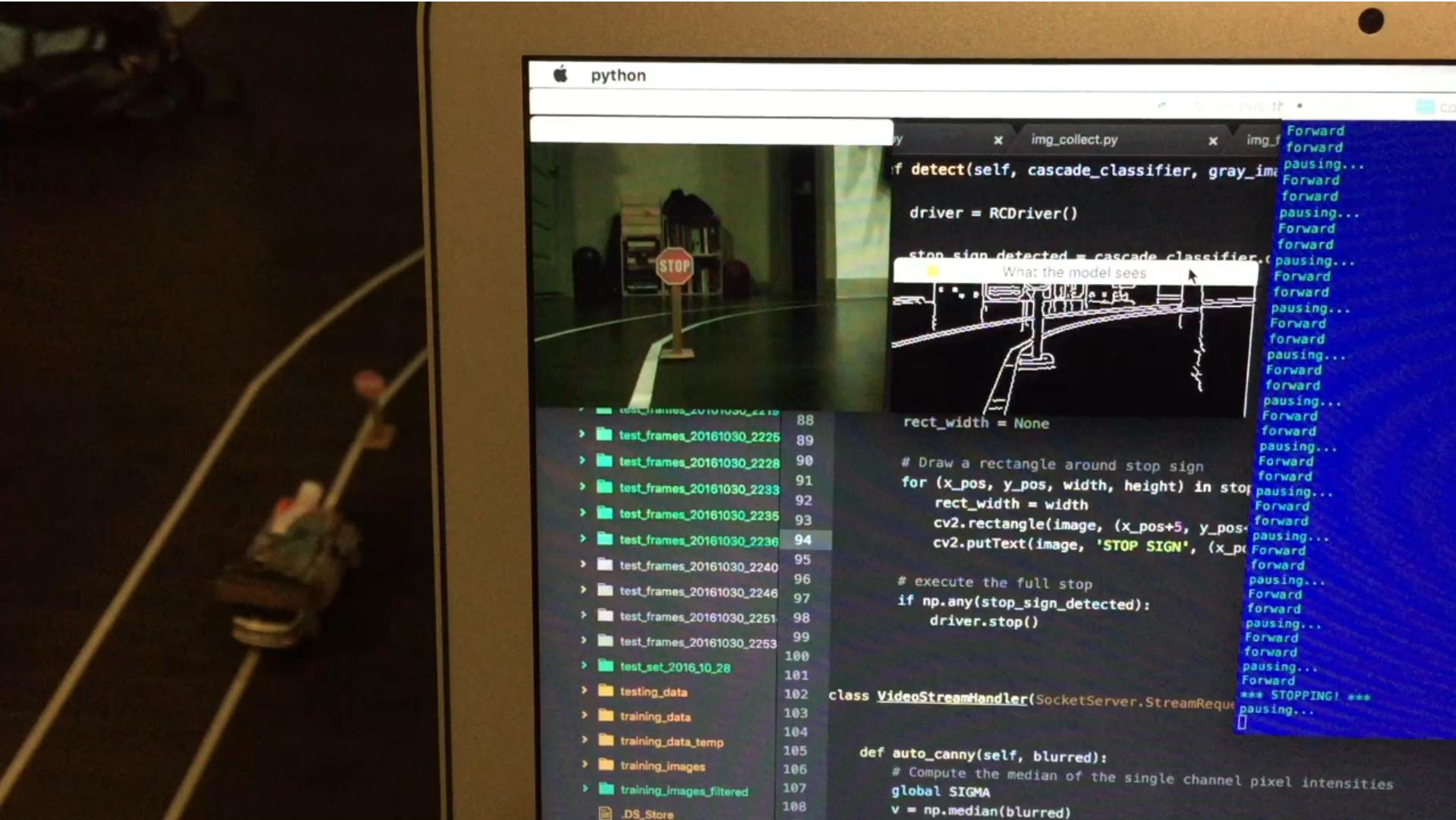
## Performance: Driving



## Performance: Driving



## Performance: Stop sign and Pedestrian detection





## Packages Used

### Image Processing

- cv2 (OpenCV v3.1.0)
- imutils



### Neural Network

- keras (TensorFlow backend)



### Other

- numpy
- picamera
- pygame
- pySerial
- scikit-learn
- socket
- threading

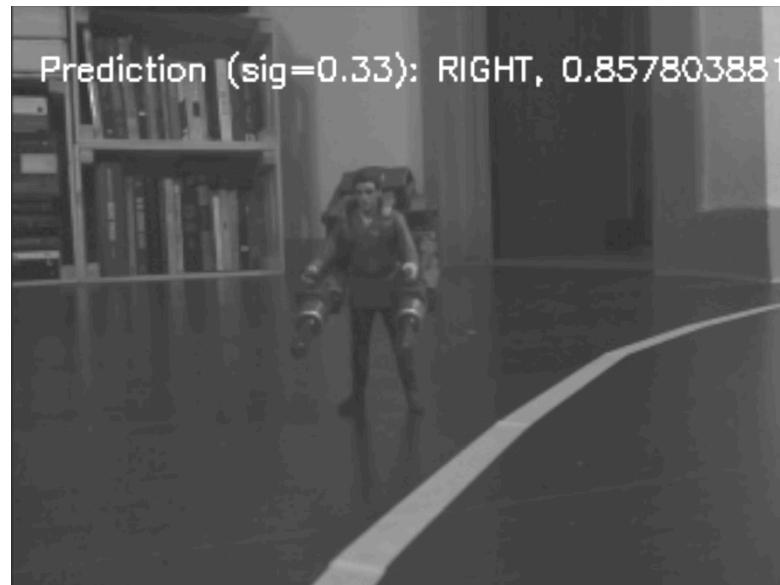


Special thanks to

- **Grace** (my wife)
- **AutoAuto** (hackathon group)
- **Hamuchiwa** (inspiration & Github repo)



## Questions?



paul.j.yim@gmail.com

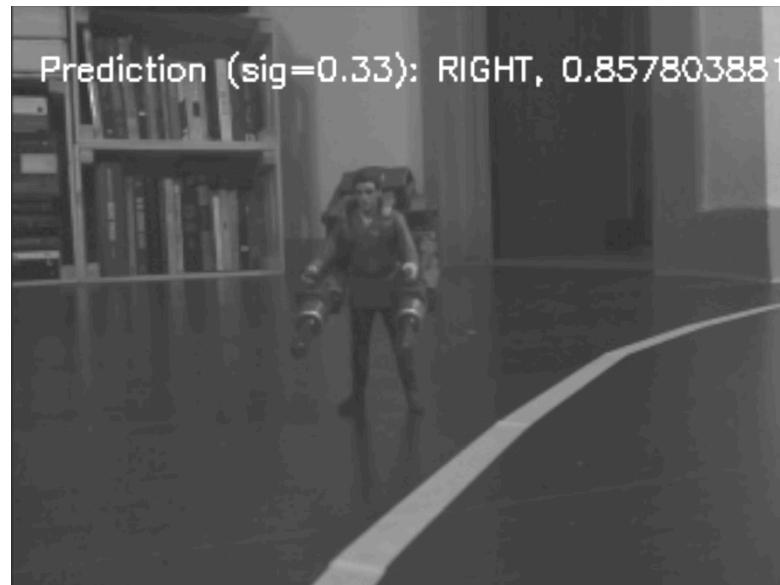


pauljyim



pseudoyim

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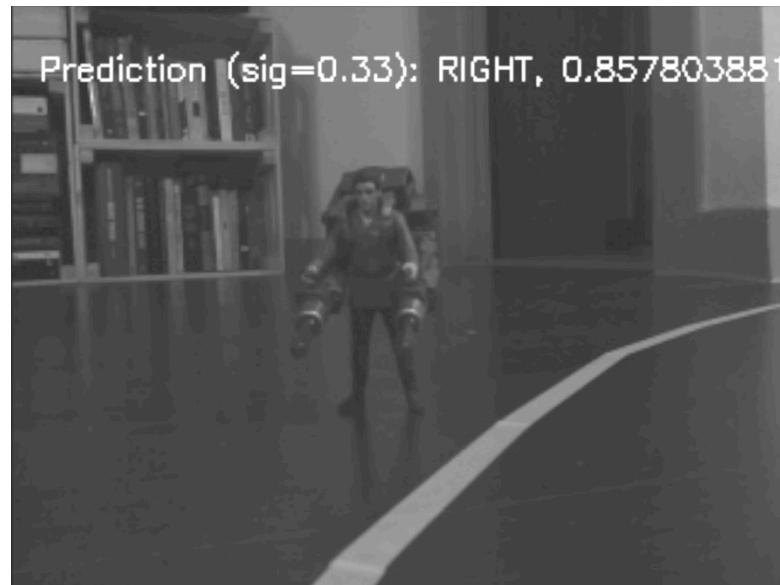


pauljyim



pseudoyim

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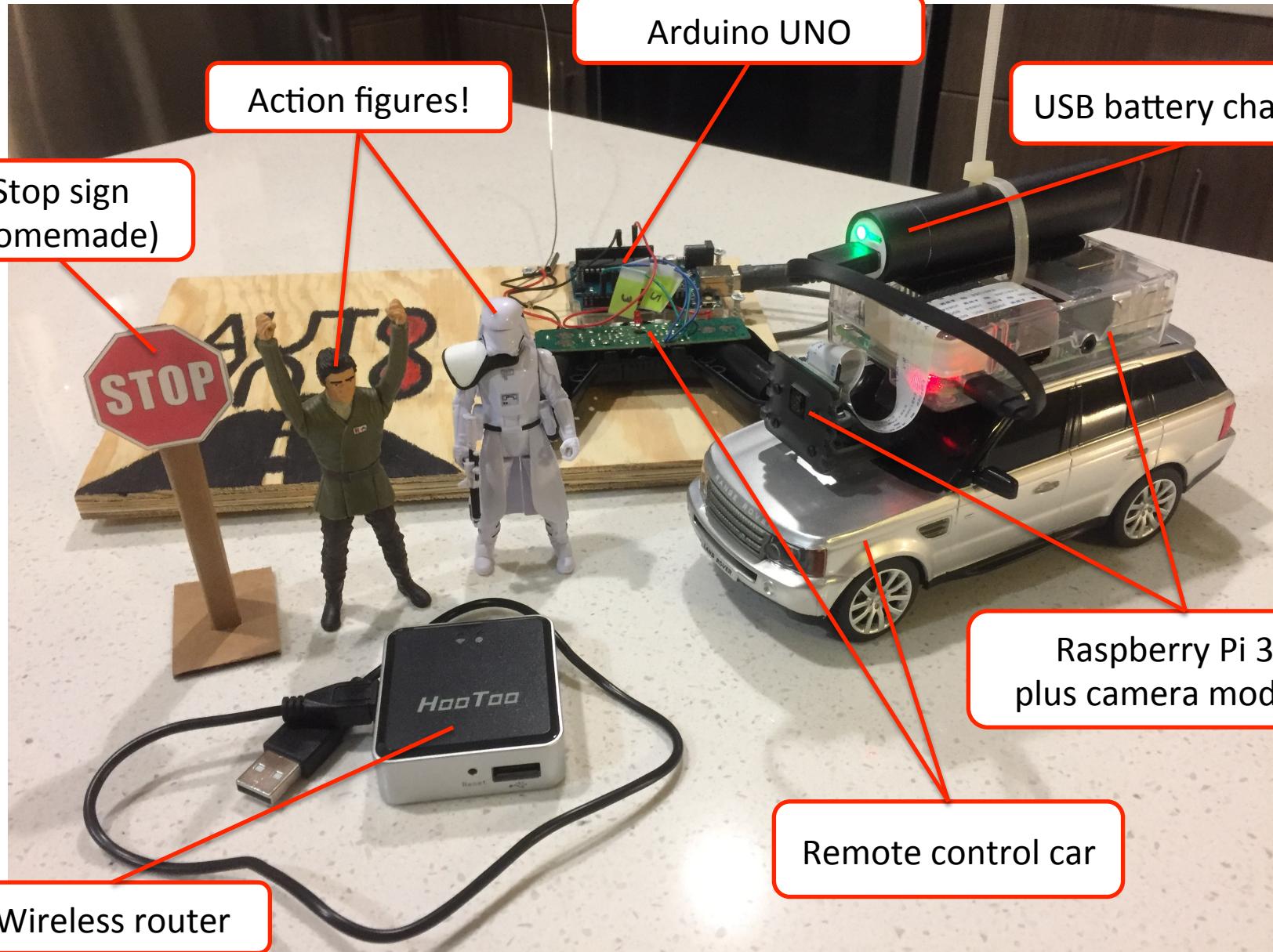


pseudoyim

## Performance: Driving (**Not so good**)



## Physical materials (all items sold separately)



# galvanEye

A remote control car that drives itself using  
OpenCV and neural networks

Capstone project  
galvanize Data Science Immersive  
August 2016

