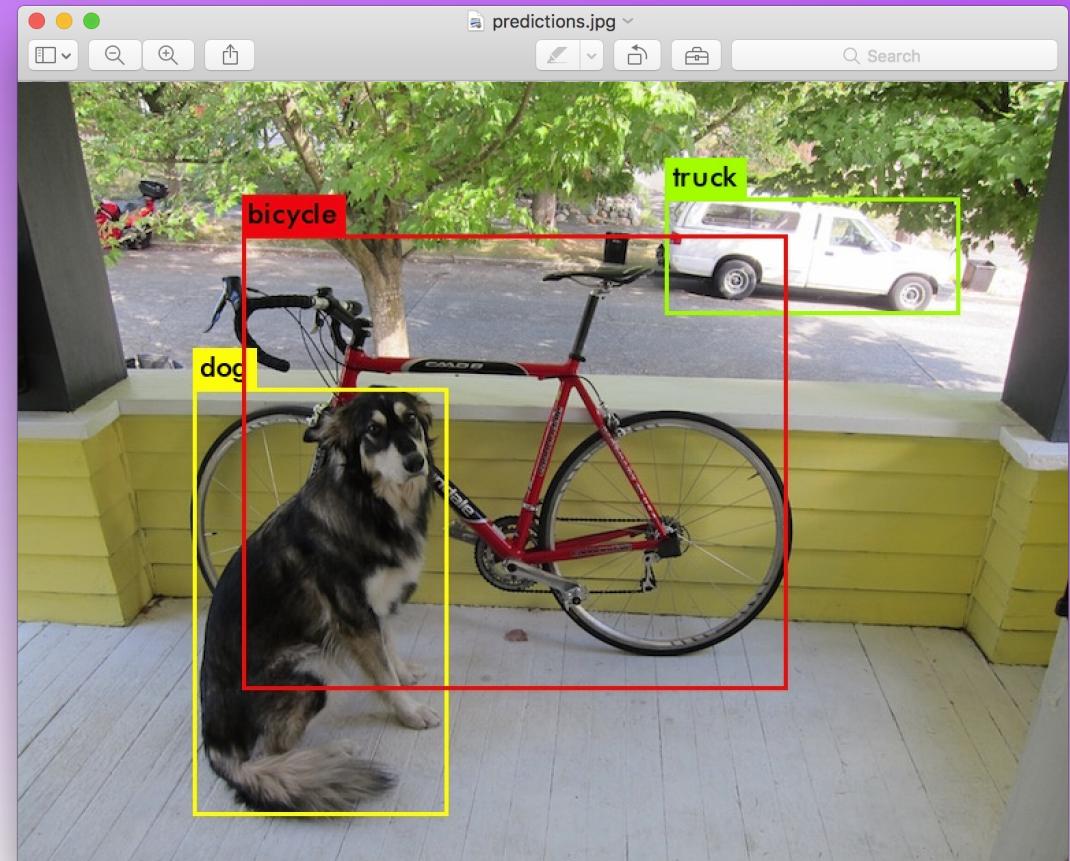


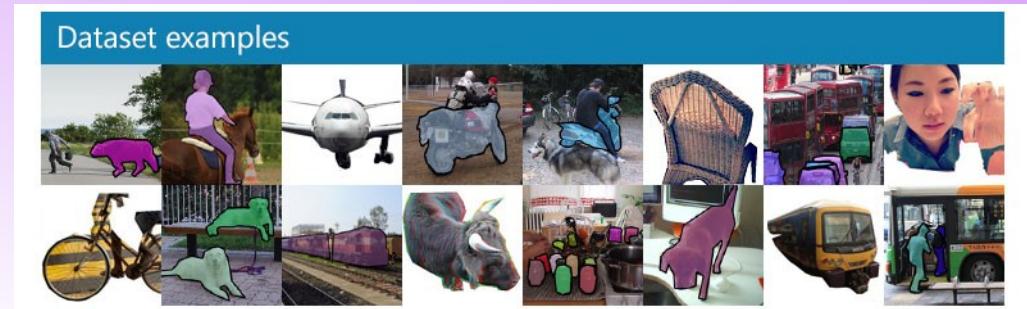
# Computer Vision with YOLO (You Only Look Once)



# Computer Vision



- Classic Computer Vision Model
  - Read/Decode Frame
  - Sequence of Image Processing
    - Convert colorspace
    - Reduce/Remove Noise (e.g. blur)
    - Thresholding/Edge Detection
    - Convolution (grow/shrink)
  - Pixels to Features
    - Bounding boxes to group features
  - Features to Object(s)



# YOLO



- Joseph Redmon – University of Washington
- ~~Detector => Classifier~~
- Classifier as a Detector
  - Subsample image into regions
  - Assume each region has an object, run classifier on each
  - Merge classifier groups into final object(s)

# Darknet

- Open Source Neural Network
  - C
  - CUDA
  - CPU & GPU Processing Capabilities

# coco – Common Objects in Context

- Image Dataset for Training
- 127,000+ images
- 880,000 instances (e.g. objects)



# Detectable Objects

- Default configuration pretrained on COCO dataset
- This classifier can be custom trained

|                |          |             |              |               |              |               |               |
|----------------|----------|-------------|--------------|---------------|--------------|---------------|---------------|
| aeroplane      | bird     | cat         | fire hydrant | knife         | pottedplant  | sofa          | toilet        |
| apple          | boat     | cell phone  | fork         | laptop        | refrigerator | spoon         | toothbrush    |
| backpack       | book     | chair       | frisbee      | microwave     | remote       | sports ball   | traffic light |
| banana         | bottle   | clock       | giraffe      | motorbike     | sandwich     | stop sign     | train         |
| baseball bat   | bowl     | cow         | hair drier   | mouse         | scissors     | suitcase      | truck         |
| baseball glove | broccoli | cup         | handbag      | orange        | sheep        | surfboard     | tvmonitor     |
| bear           | bus      | diningtable | horse        | oven          | sink         | teddy bear    | umbrella      |
| bed            | cake     | dog         | hot dog      | parking meter | skateboard   | tennis racket | vase          |
| bench          | car      | donut       | keyboard     | person        | skis         | tie           | wine glass    |
| bicycle        | carrot   | elephant    | kite         | pizza         | snowboard    | toaster       | zebra         |

# Setup/Install

- Ubuntu 16.04
  - sudo apt-get install -y libopencv-dev
  - sudo apt-get install -y python3
  - sudo apt-get install -y python3-dev
  - sudo apt-get install -y python3-pip
  - sudo pip3 install pip --upgrade
  - sudo pip3 install opencv-python
  - sudo pip3 install numpy
  - sudo pip3 install cylon
  - sudo pip3 install yolo34py
  - wget <https://raw.githubusercontent.com/pjreddie/darknet/master/cfg/yolov3.cfg>
  - wget <https://pjreddie.com/media/files/yolov3.weights>
  - wget <https://raw.githubusercontent.com/pjreddie/darknet/master/cfg/coco.data> -O data/coco.data
  - wget <https://raw.githubusercontent.com/pjreddie/darknet/master/data/coco.names> -O data/coco.names

# Setup Directory Structure

```
/var/tmp/YOLO-python$ tree .
```

```
.-+
   +-- data
   |    +-- coco.data
   |    +-- coco.names
   +-- example
   +-- sample.jpg
   +-- video.mp4
   +-- yolov3.cfg
   +-- yolov3.weights
```

1 directory, 7 files

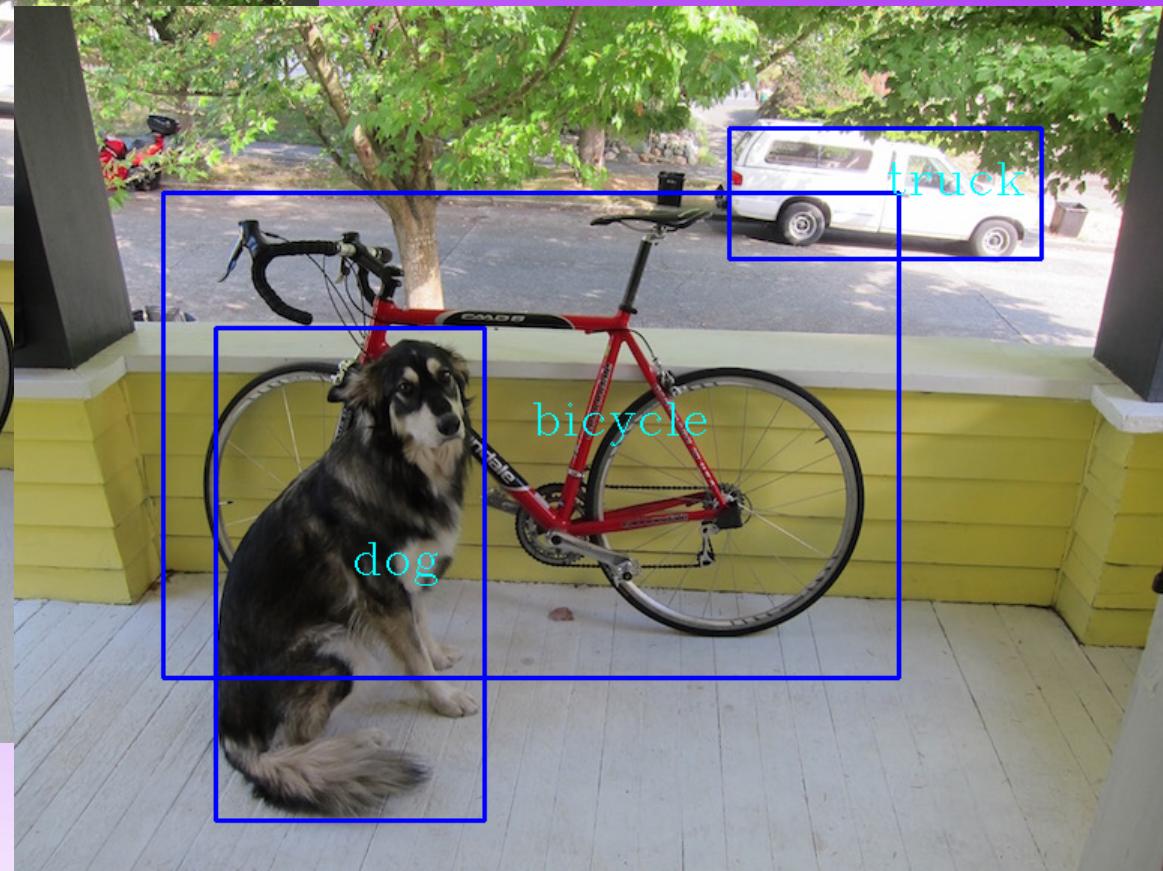
- Python example: *example*
- Test image: *sample.jpg*
- Test video: *video.mp4*
- *YOLO Neural Net Configuration (cfg & weights)*

# Python Example – Image

```
$ cat -n example
 1      #!/usr/bin/python3
 2
 3      from pydarknet import Detector, Image
 4      import cv2
 5
 6      net = Detector(bytes('yolov3.cfg', encoding='utf-8'), bytes('./yolov3.weights', encoding='utf-8'), 0,
bytes('./data/coco.data',encoding='utf-8'))
 7
 8      img = cv2.imread('./sample.jpg')
 9      img_darknet = Image(img)
10
11      results = net.detect(img_darknet)
12
13      for cat, score, bounds in results:
14          x, y, w, h = bounds
15          cv2.rectangle(img, (int(x - w / 2), int(y - h / 2)), (int(x + w / 2), int(y + h / 2)), (255, 0, 0),
thickness=2)
16          cv2.putText(img,str(cat.decode('utf-8')), (int(x),int(y)),cv2.FONT_HERSHEY_COMPLEX,1,(255,255,0))
17
18      cv2.imshow('output', img)
19      cv2.waitKey(0)
```

- Initialize Detector
- Read Image
- Process Image w/Detector
- Draw Bounding Box & Label Around Detections
- Display

# Results - Image



# Python Example – Video

```
$ cat -n example
 1  #!/usr/bin/python3
 2
 3  from pydarknet import Detector, Image
 4  import cv2
 5
 6  net = Detector(bytes('yolov3.cfg', encoding='utf-8'), bytes('./yolov3.weights', encoding='utf-8'), 0,
bytes('./data/coco.data',encoding='utf-8'))
 7  vidCapture = cv2.VideoCapture('video.mp4')
 8  K=0;
 9  gotFrame=True;
10 while(vidCapture.isOpened() and gotFrame):
11     gotFrame, frame = vidCapture.read()
12     if gotFrame:
13         print('frame',K);
14         img_darknet = Image(frame);
15         results = net.detect(img_darknet);
16         for cat, score, bounds in results:
17             x, y, w, h = bounds
18             cv2.rectangle(frame, (int(x - w / 2), int(y - h / 2)), (int(x + w / 2), int(y + h / 2)), (255, 0,
0), thickness=2)
19             cv2.putText(frame,str(cat.decode('utf-8')), (int(x),int(y)),cv2.FONT_HERSHEY_COMPLEX,1,(255,255,0))
20             cv2.imwrite('frame%03d.jpg'%(K), frame);
21     K+=1;
22     vidCapture.release();
23     cv2.destroyAllWindows();
```

- Initialize Detector
- Foreach Image
- Process Image w/Detector
- Draw Bounding Box & Label Around Detections
- Save Image

# Results - Video



Rock or Bust

AC/DC

# Performance

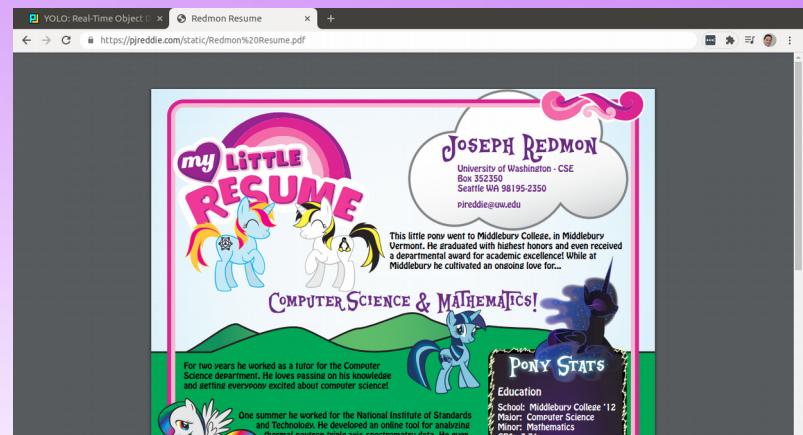
- Intel(R) Core(TM) i5-3210M CPU @ 2.50GHz
  - 8 year old dinosaur
    - ~30 sec / frame detection latency
- 1920x1080, 960x540, 480x270, 240x130
  - Approximately same detection latency
  - Contradicts typical pixel-wide image processing performance
- Actual Mileage will Vary
- GPU Acceleration is possible
- Real-Time Performance on COTS Systems (30 fps)

# Example Application : Computer Vision-Based Video Cropping



# References

- <https://pjreddie.com/darknet/>
- <https://pjreddie.com/darknet/yolo/>
- <https://www.youtube.com/watch?v=Cgxsv1riJhI>
- <https://arxiv.org/pdf/1506.02640.pdf>
- <https://pjreddie.com/static/Redmon%20Resume.pdf>



# Contact Info

- Slides:
  - <https://github.com/fsk-software/pub/>
    - YOLO-pymntos
- Blog: <http://dragonquest64.blogspot.com>
- Slack: [pymntos.slack.com](https://pymntos.slack.com) lipeltgm