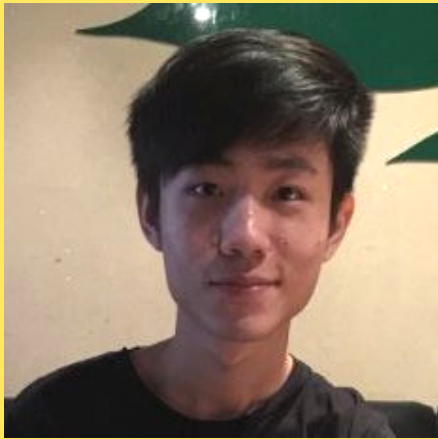


# **FOOD IMAGE CLASSIFICATION USING CONVOLUTIONAL NEURAL NETWORK**

05/08/2017 Barcamp Cyberjaya 2017



JACK GOH

## ABOUT ME

- / Finished study at MMU Mid June 2017
- / Co-founder BOTAHEAD PLT
- / ML Developer at Coqnitiq Sdn Bhd



# ABOUT THE PROJECT

/ Final Year Project (July 2016 - Feb 2017)

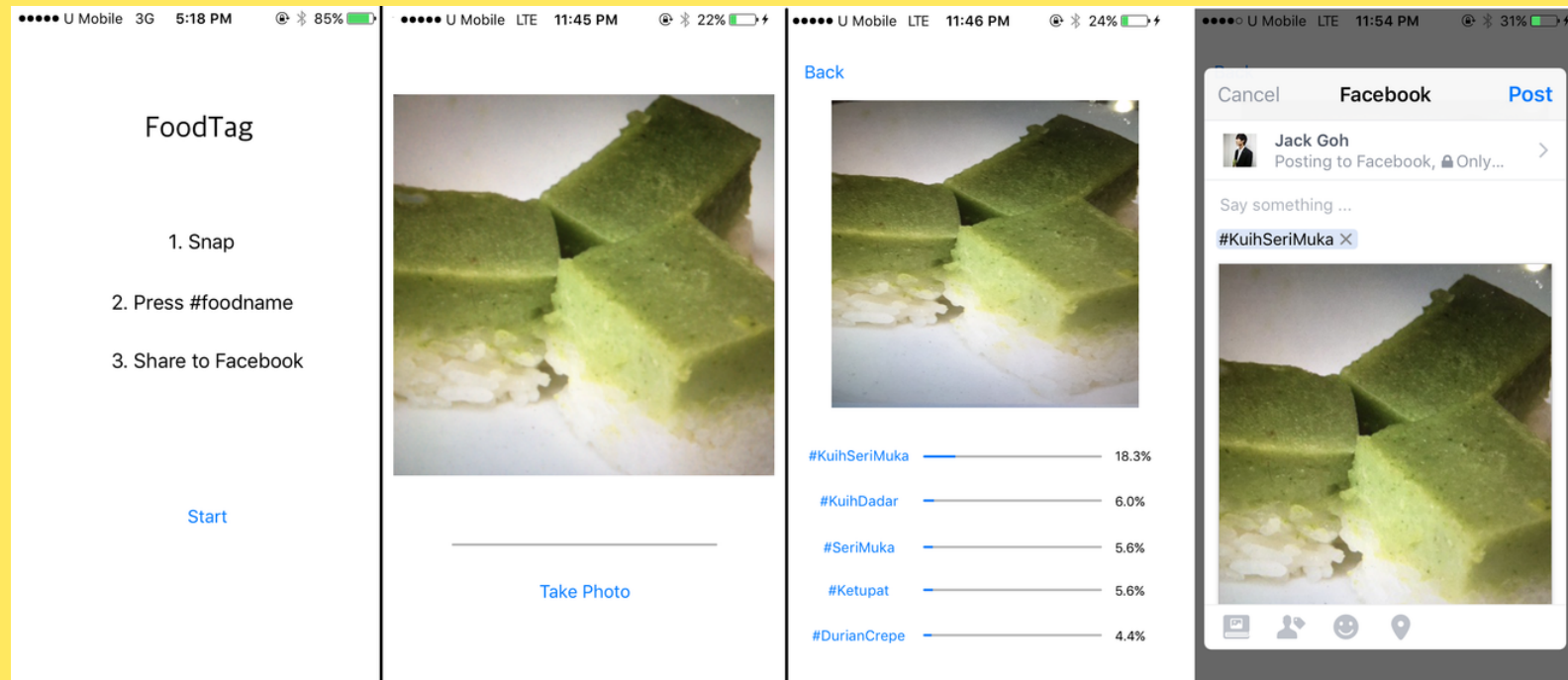
/ Food Tag : Automatic Classify Food Photos

/ (Hot dog or not Hot dog)

## 03 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

# IOS APP

<https://github.com/jackg0h/foodtagApp>

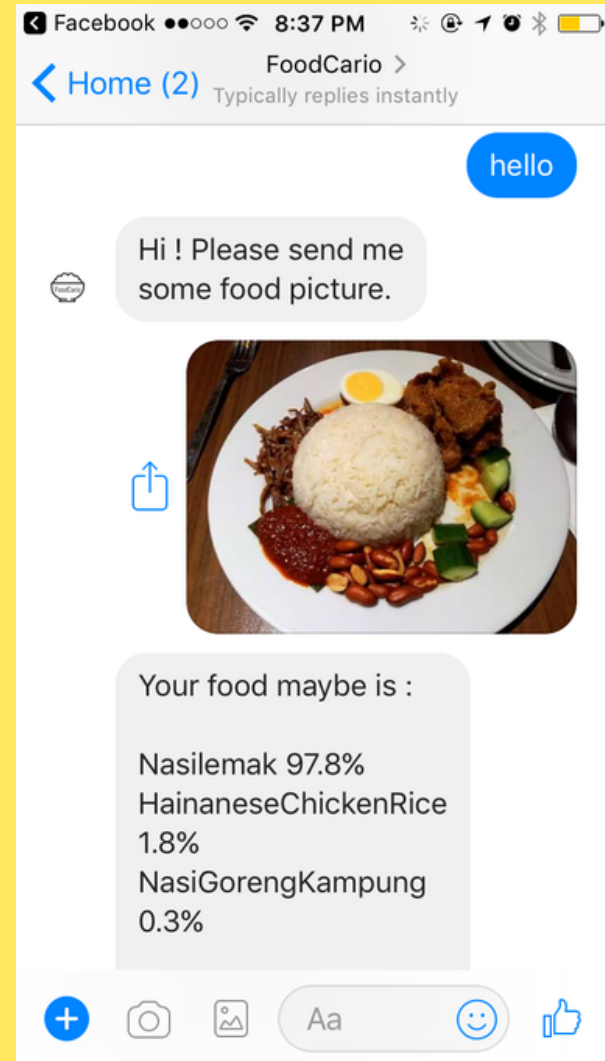


## CHATBOT (MESSENGER)

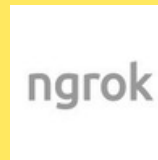
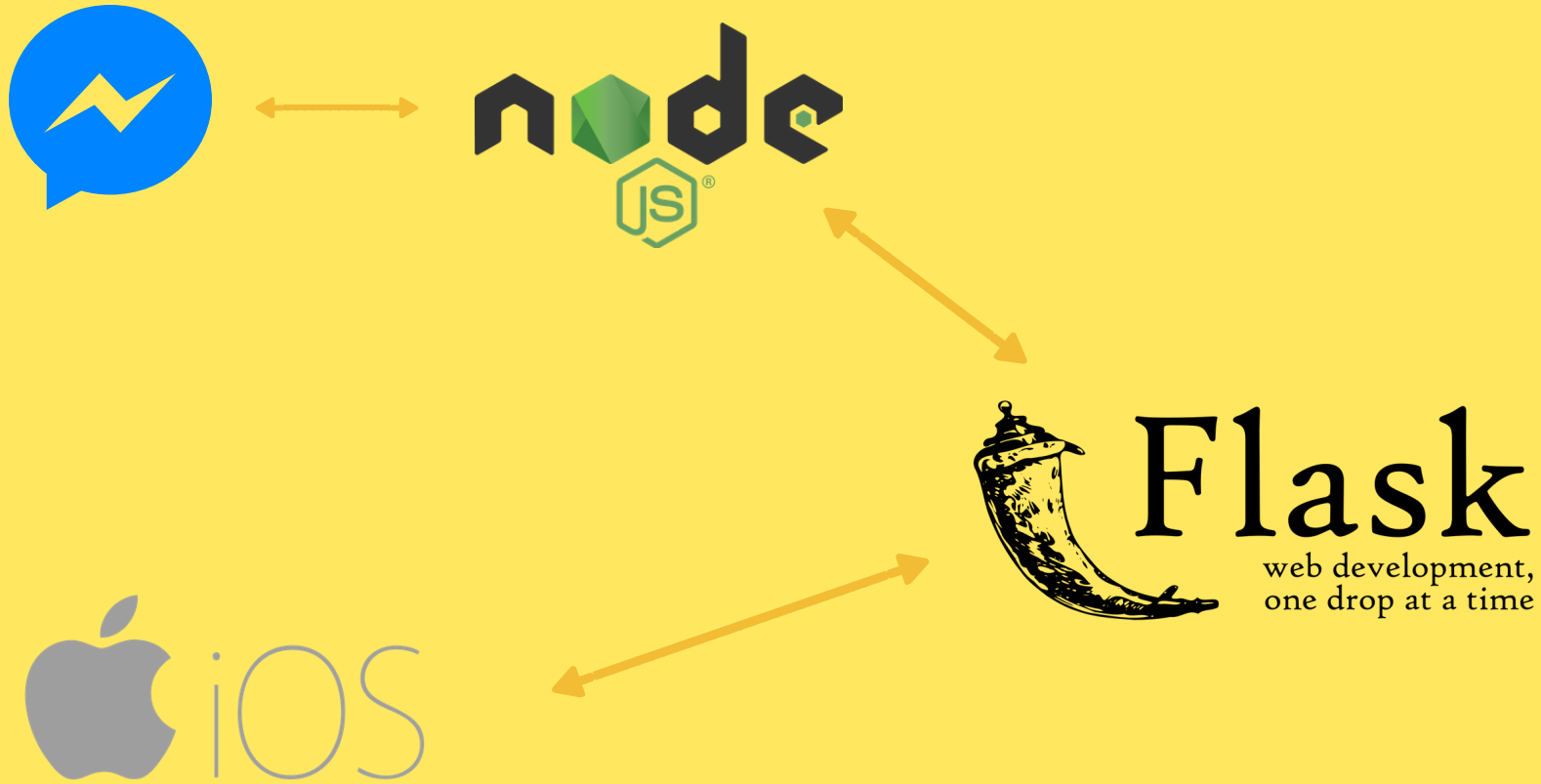
<https://m.me/foodcario>

or

<http://foodcario.com>



## 04.1 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING



## 05 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

### HANDCRAFTED

- Handcrafted feature extraction
- Specific
- Pre-defined

### DEEP LEARNING

- Automatically learn features
- Robust
- Generalizable
- Performance improves with more data

## 06 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

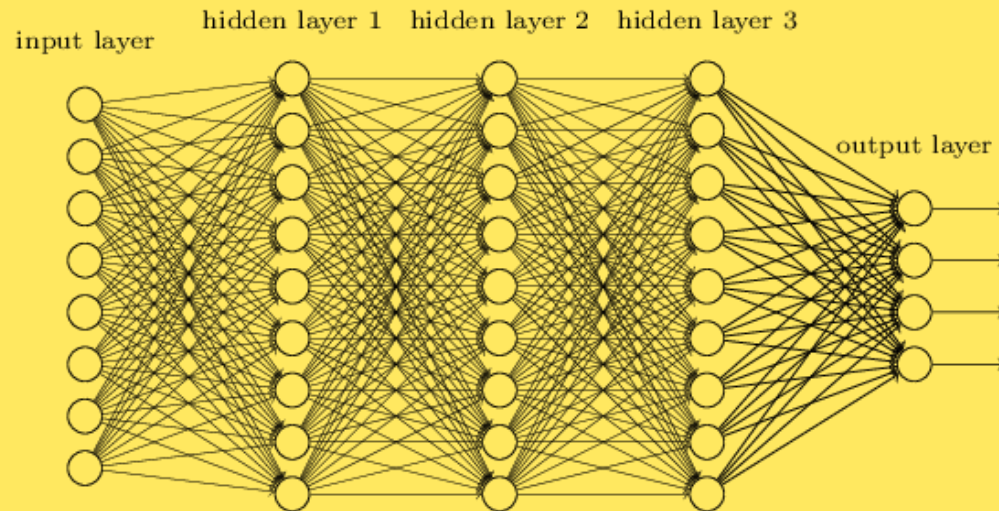
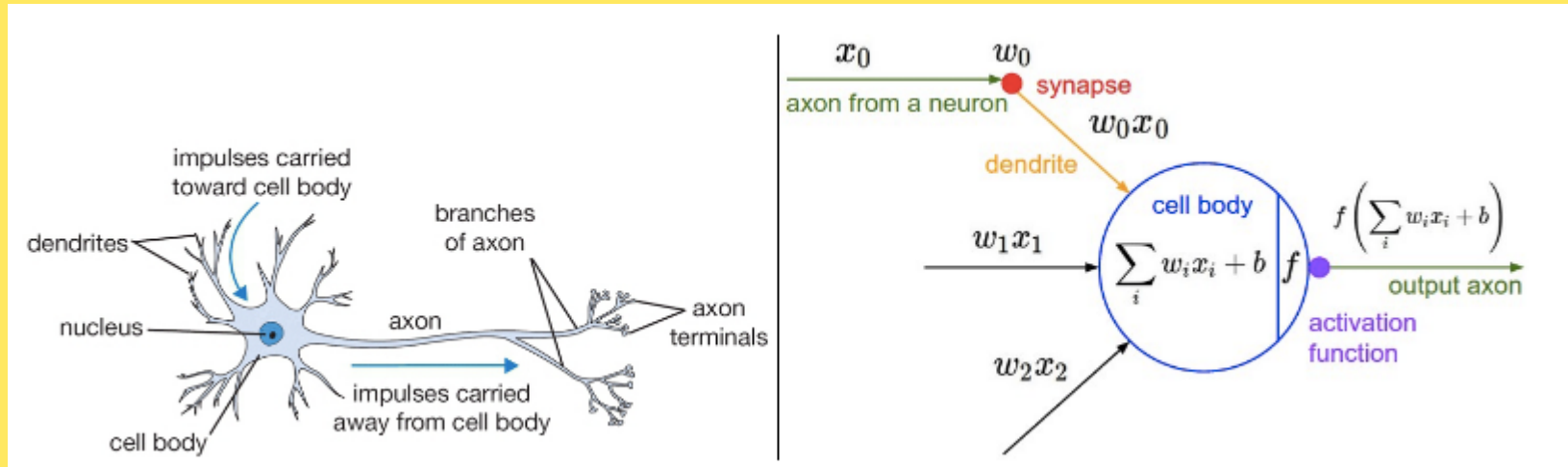


**Source: Convolutional Neural Networks in Practice // Cassidy Williams, Clarifai**



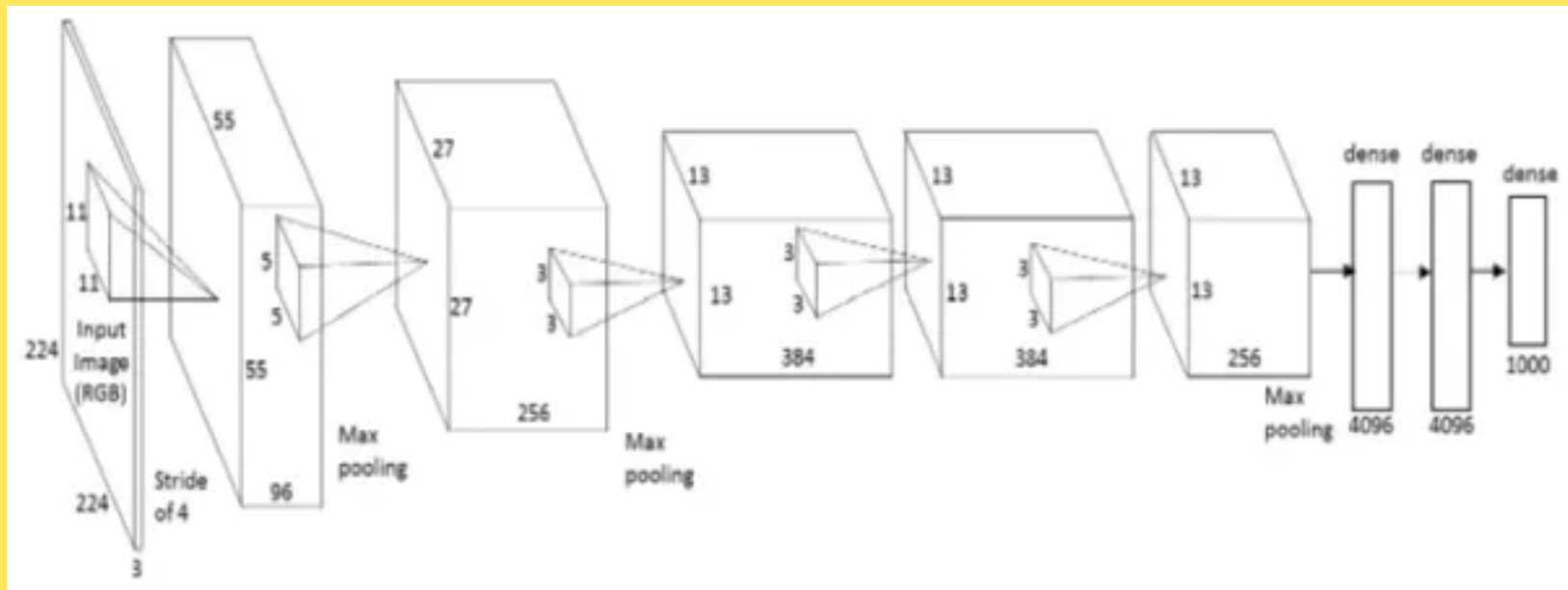
# Neural Network

Source: cs231n Stanford University

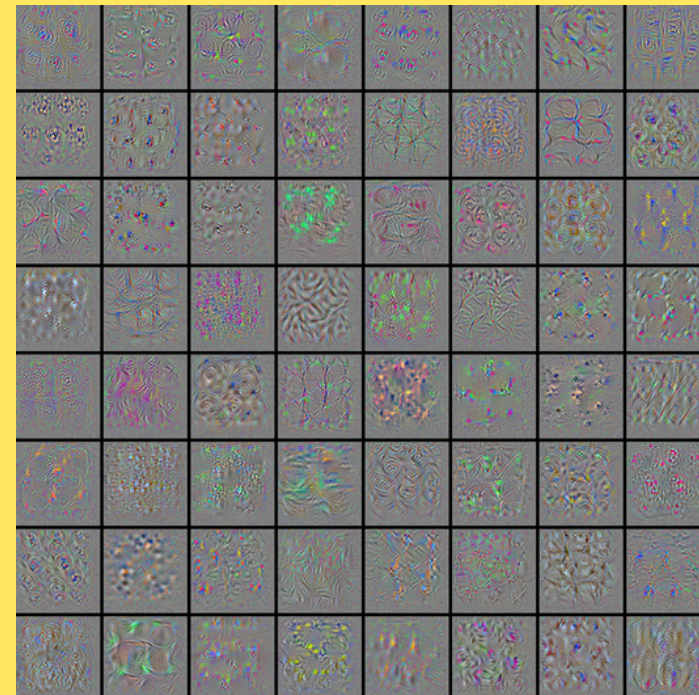
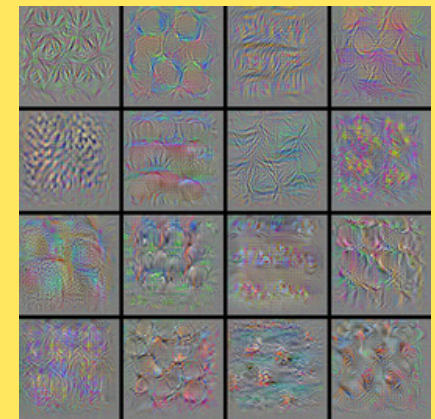
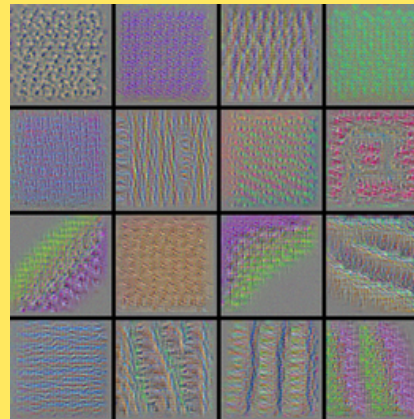
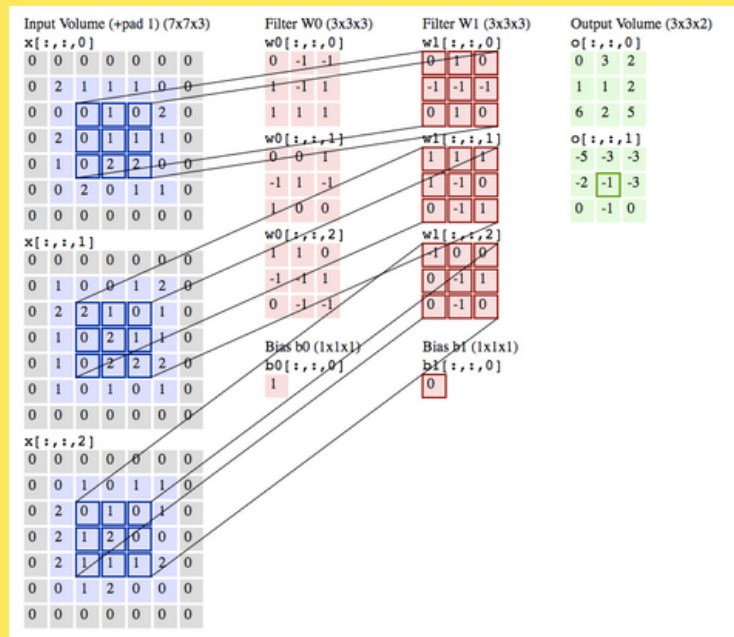


## 08 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

### Convolution Neural Network



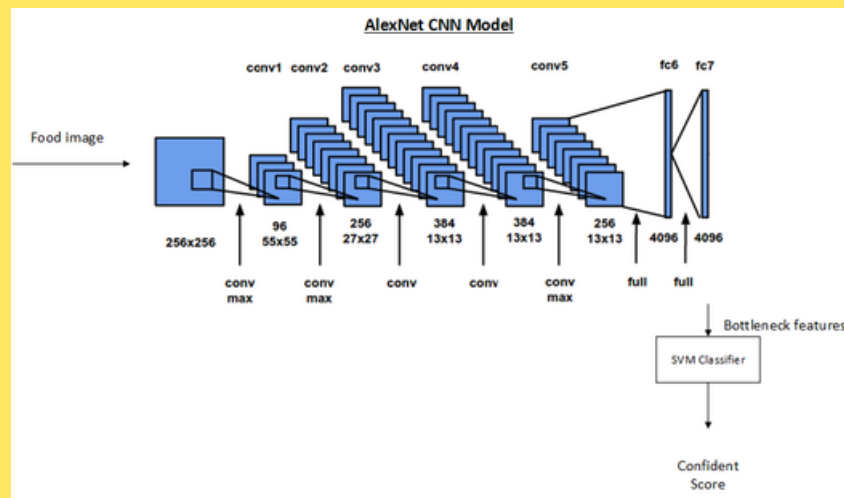
# 09 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING



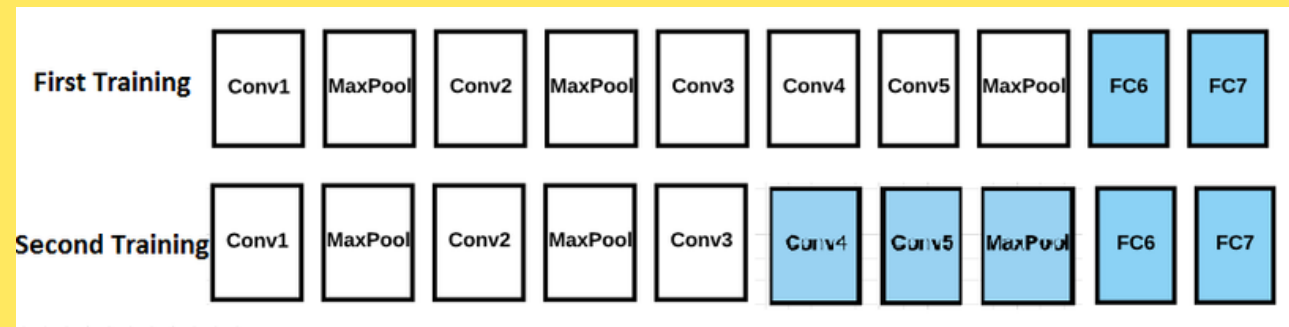
## 10 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

### My Purposed Pipeline (Transfer Learning)

Feature Extraction



Finetuning



# 11 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

## Data Augmentation





## 12 FOOD IMAGE CLASSIFICATION USING DEEP LEARNING

### Results (Accuracy)

Without Data Augmentation

Method Used	Top-1 (%)			Top-5 (%)		
	Fold1	Fold2	Avg Acc	Fold1	Fold2	Avg Acc
<i>TrainedFromScratch</i>	30.70	29.59	30.19	59.77	58.06	58.92
<i>DeepCNNfeatures(fc7)</i>	33.97	33.55	33.76	62.10	62.58	62.34
<i>Finetuning(fc6, fc7)</i>	36.67	36.66	36.67	66.05	66.16	66.11
<i>Finetuning(conv5, fc6, fc7)</i>	36.66	36.87	36.77	65.97	66.16	66.07
Dual fine-tuning (fc6, fc7), then (conv4, conv5, fc6, fc7)	40.10	39.78	39.94	70.12	70.12	70.12

With Data Augmentation

Method Used	Top-1	Top-5
Trained From Scratch	57.53%	87.38%
Finetuning (fc6, fc7)	49.26%	79.59%
Finetuning (conv5, fc6, fc7)	<b>68.25%</b>	<b>92.73%</b>
Dual fine-tuning (fc6, fc7), then (conv4, conv5, fc6, fc7)	58.25%	85.58%

## Results (Speed)

With XEON 2670v1

With GTX1060 6GB

Method Used	CPU	GPU
Trained From Scratch	993 seconds	50 seconds
Finetuning (fc6, fc7)	597 seconds	32 seconds
Finetuning (conv5, fc6, fc7)	596 seconds	30 seconds
Dual fine-tuning (fc6, fc7), then (conv4, conv5, fc6, fc7)	624 seconds	33 seconds

Table 6.4: Deep Learning Method Computation Time (second/epoch) Without Data Augmentation)

Method Used	CPU	GPU
Trained From Scratch	1070 seconds	106 seconds
Finetuning (fc6, fc7)	690 seconds	112 seconds
Finetuning (conv5, fc6, fc7)	716 seconds	109 seconds
Dual fine-tuning (fc6, fc7), then (conv4, conv5, fc6, fc7)	722 seconds	107 seconds

Table 6.5: Deep Learning Method Computation Time (second/epoch) With Data Augmentation

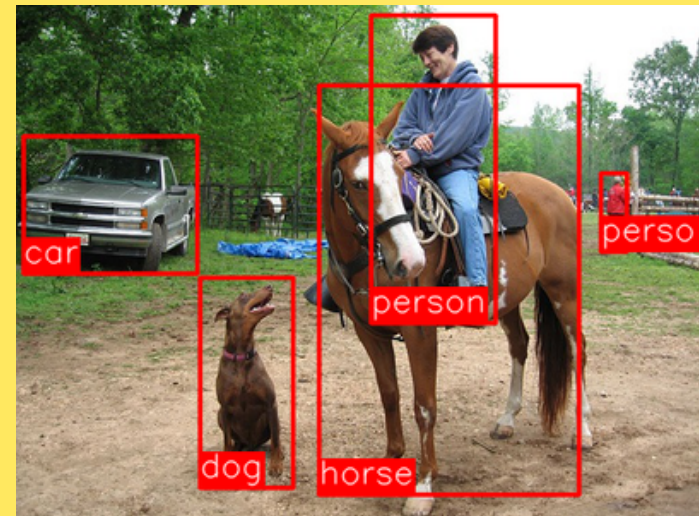
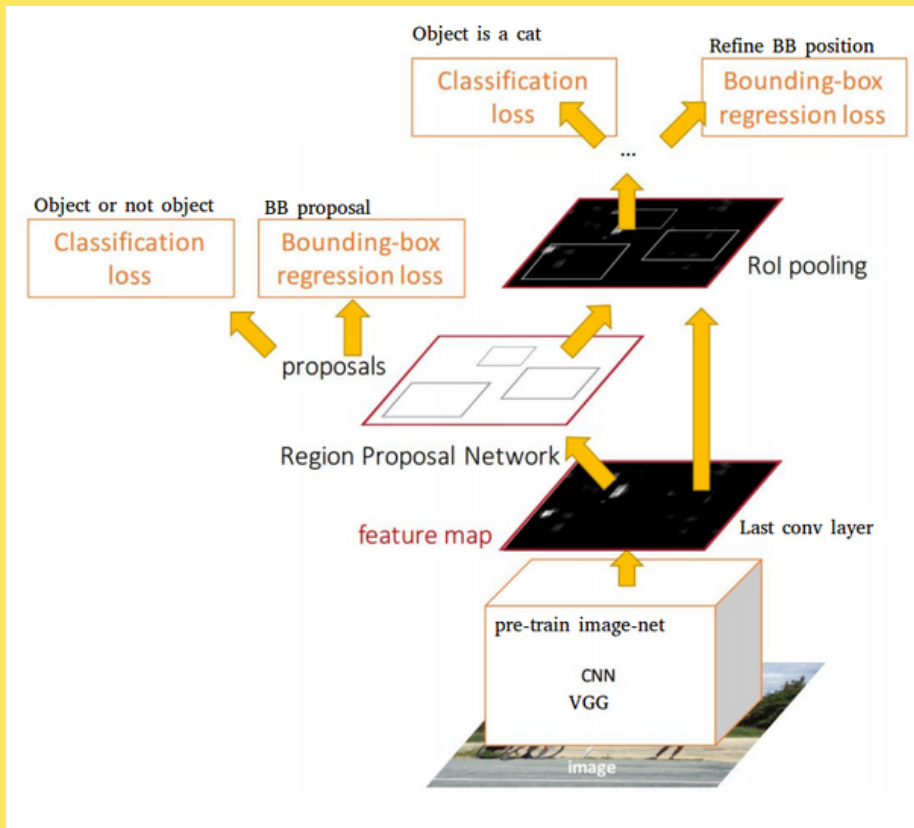
Code Demo?

<https://github.com/jackg0h/barcampcyber2017>



# What next ?

## Region Based CNN (RCNN)



# Resources

<http://keras.io>

<http://cs231n.stanford.edu/>

<https://blog.keras.io/building-powerful-image-classification-models-using-very-little-data.html>

**Thank You!**

<https://m.me/foodcario>