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# FOOD IMAGE CLASSIFICATION WITH IMPROVED MOBILENET ARCHITECTURE AND DATA AUGMENTATION

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# OUTLINE

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- 1** Introduction
- 2** Related work
- 3** Methodologies
- 4** Experimental and results
- 5** Conclusion

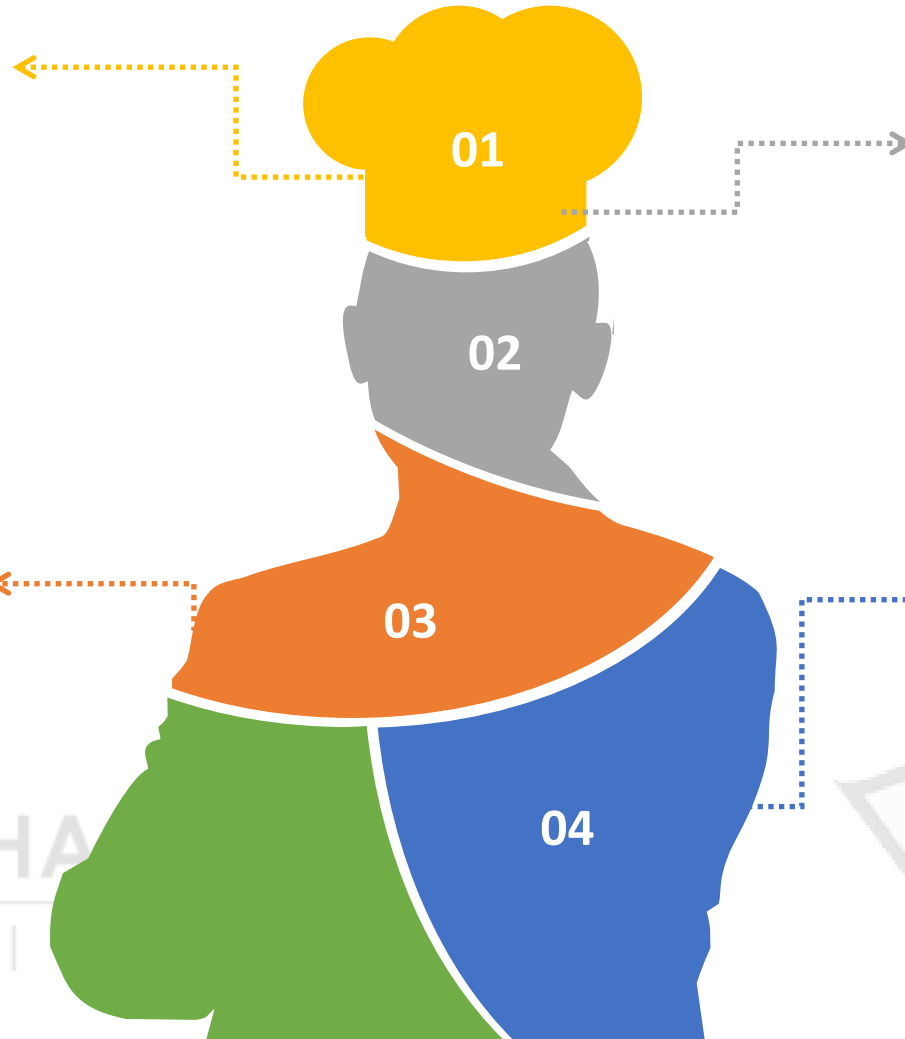
# INTRODUCTION

## What the problem?

- People are becoming obesity and overweight.

## How to classification the images?

- Hand-craft feature
- Deep learning Algorithm



## How to resolve the problem?

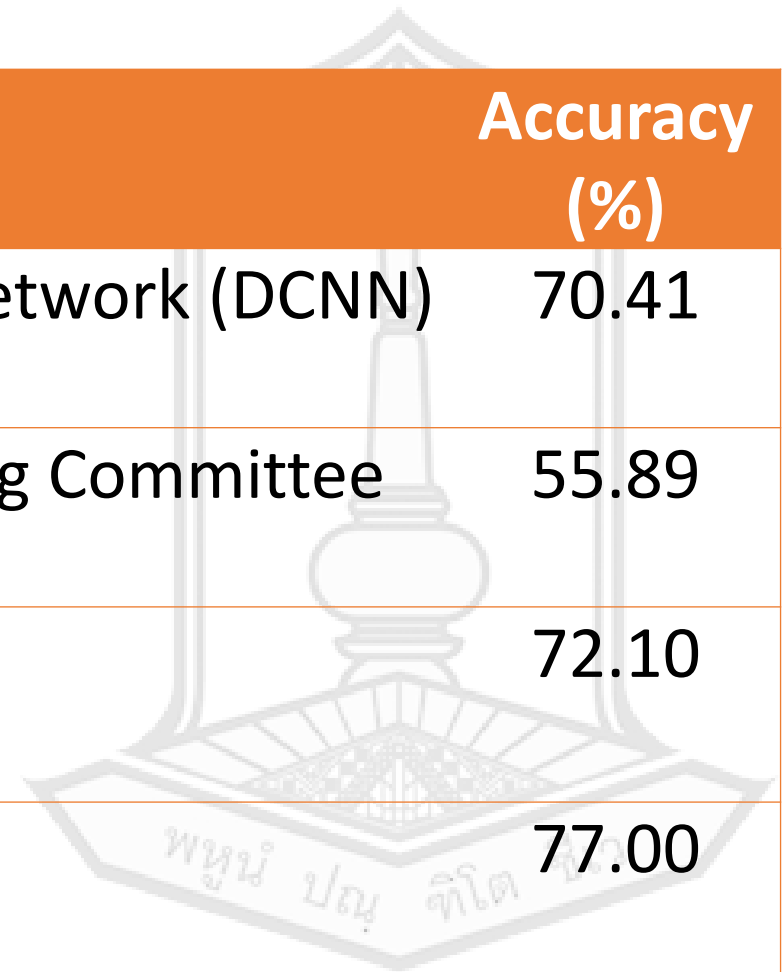
- The estimate calories system from food images.

## What the challenge?

- Images are different
- Images are similar
- Images are many object

# RELATED WORK

Reference	Method	Accuracy (%)
Yanai and Kawano [2015]	Deep Convolution Neural Network (DCNN)	70.41
Martinel et.al. [2016]	Supervised Extreme Learning Committee	55.89
Pandey et al. [2017]	FoodNet: Ensemble Net	72.10
Lin et al. [2018]	DeepFood	77.00



# CONTRIBUTION



**Improved MobileNet  
Architecture**

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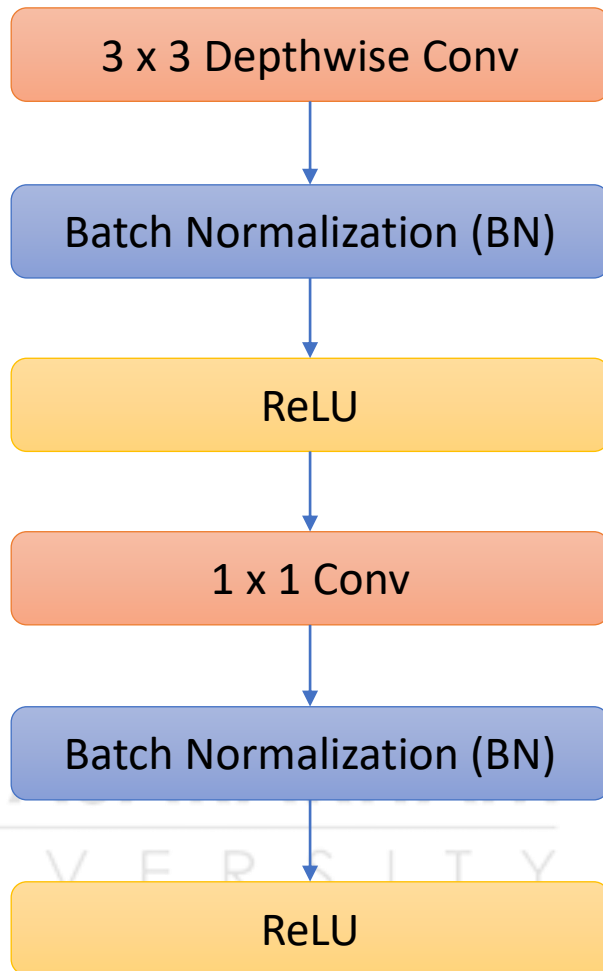
**Data Augmentation  
Technique**



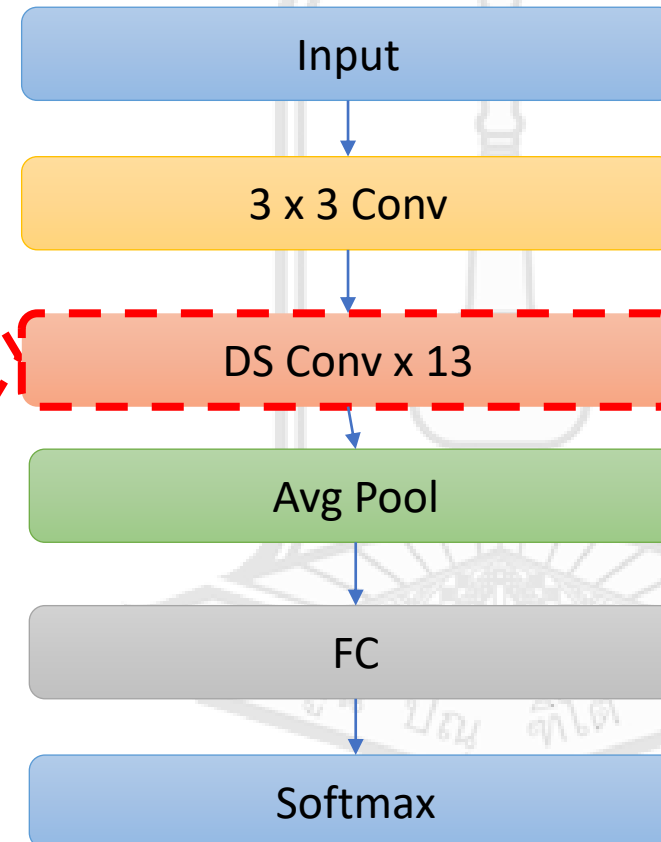
**ETH Food-101  
dataset**

# METODOLOGIES

## Depthwise Separable Convolutions (DS)

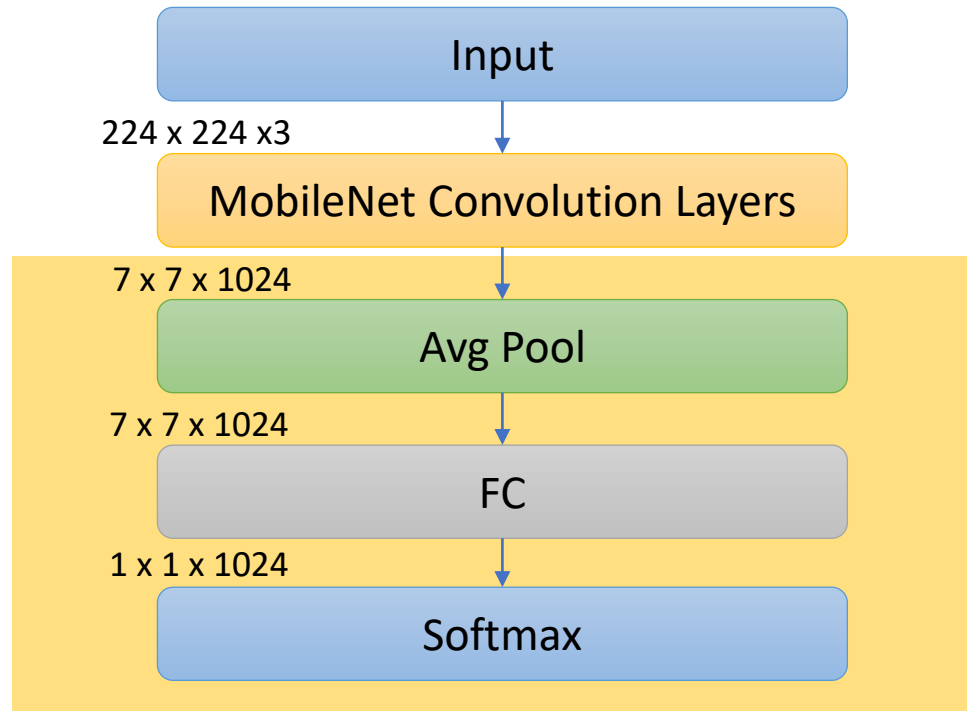


## MobileNet Structure

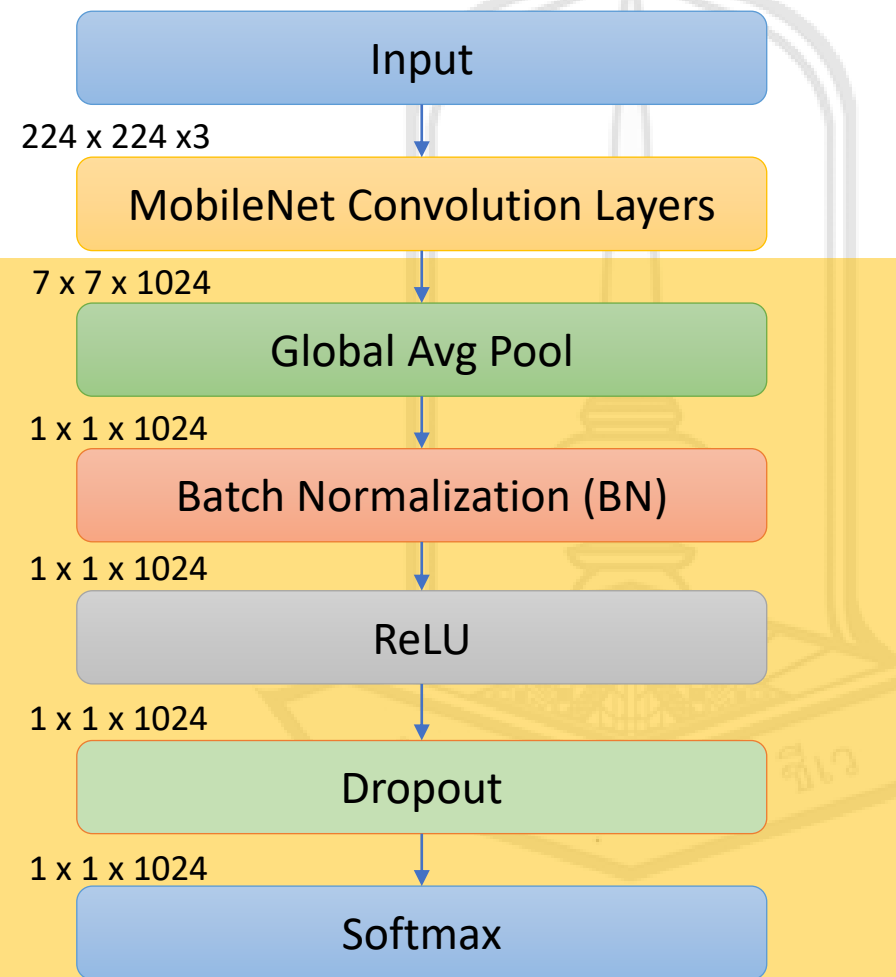


# METODOLOGIES

## MobileNet Architecture



## Proposed MobileNet Architecture



# METODOLOGIES

## 1

The data augmentation techniques ;  
rescaling, rotation, width shift, height  
shift, horizontal flip, shear, and zoom.



(A)

(B)

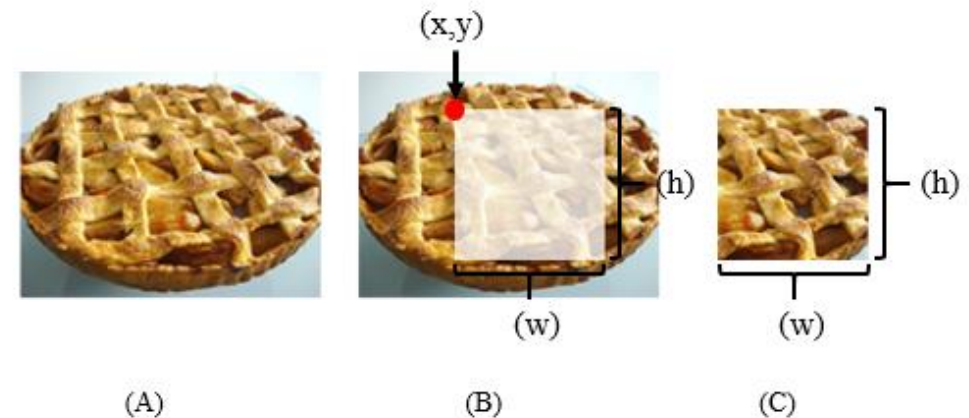
(C)

(D)

(E)

## 2

Random cropping, the position of  
points  $(x,y)$  are random, then it  
automatic cropping and resize to the  
target size.



(A)

(B)

(C)

## Data Augmentation Techniques



# EXPERIMENTAL & RESULTS

## Dataset

### ETH Food-101

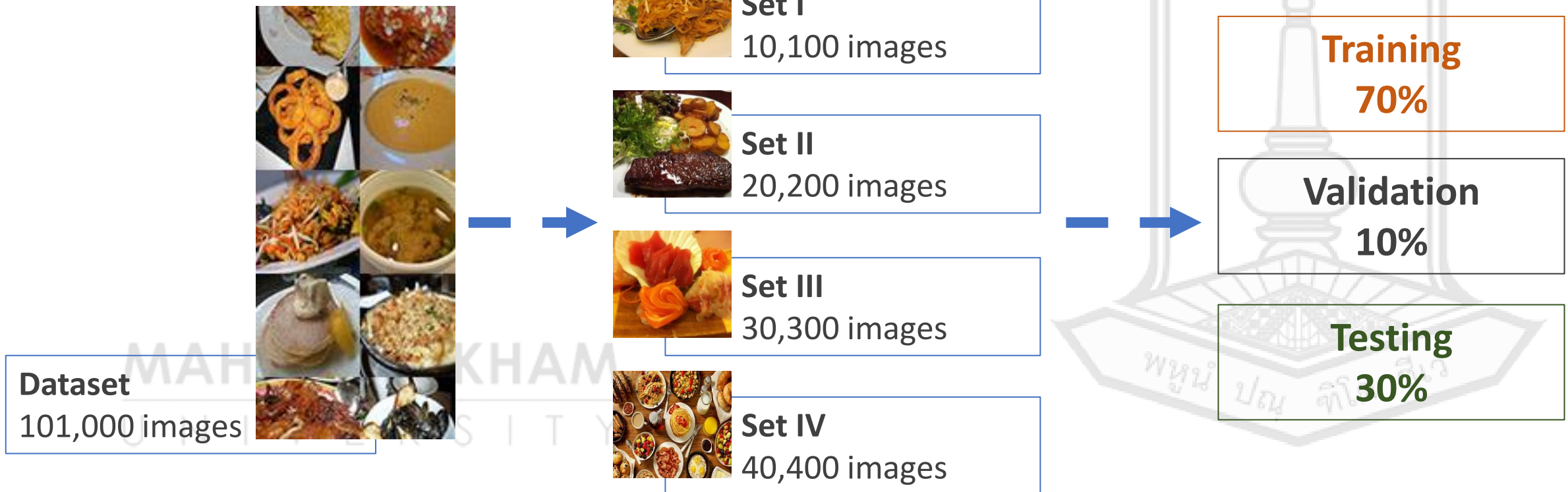
- The real-world food images are collected by downloading from foodspotting.com website.
- The food images are a mix of eastern and western meals.
- The dataset consists of 101,000 images from 101 food categories.



# EXPERIMENTAL & RESULTS

## Experimental Setup

- Divided the dataset

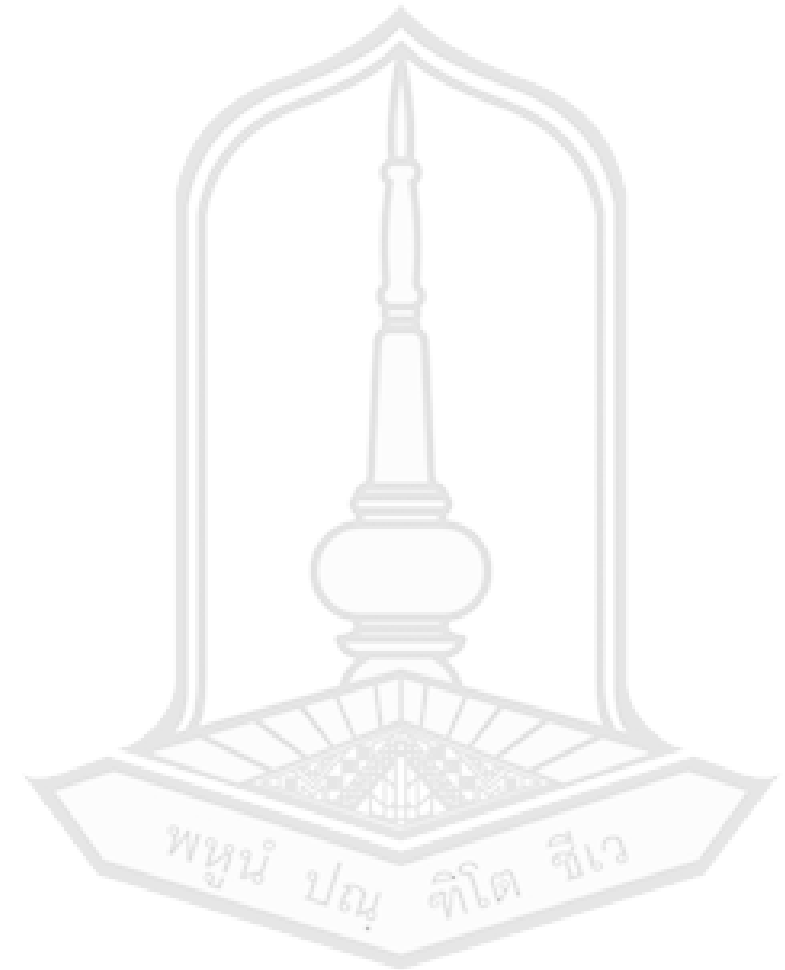


# EXPERIMENTAL & RESULTS

## Experimental Setup

- **The parameter setting**
  - ✓ Stochastic gradient descent (SGD) solver
  - ✓ Batch size of 16
  - ✓ Learning rate at 0.0001
  - ✓ TensorFlow platform
  - ✓ Intel® Core™ i7-4790 CPU
  - ✓ 8GB RAM

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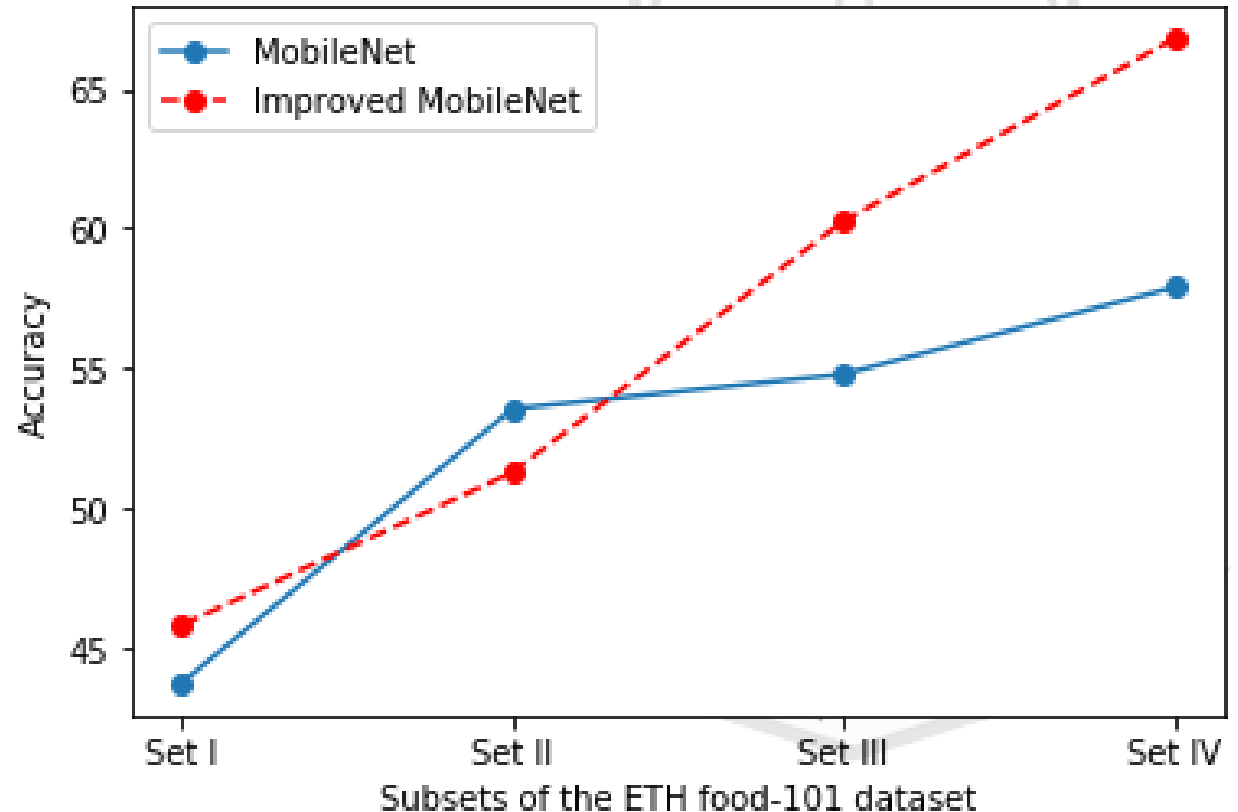


# EXPERIMENTAL & RESULTS

## Experimental Results

The performance of the **MobileNet** and **improved MobileNet** architectures versus the different number of training samples (Set I - Set IV) on the ETH food-101 dataset.

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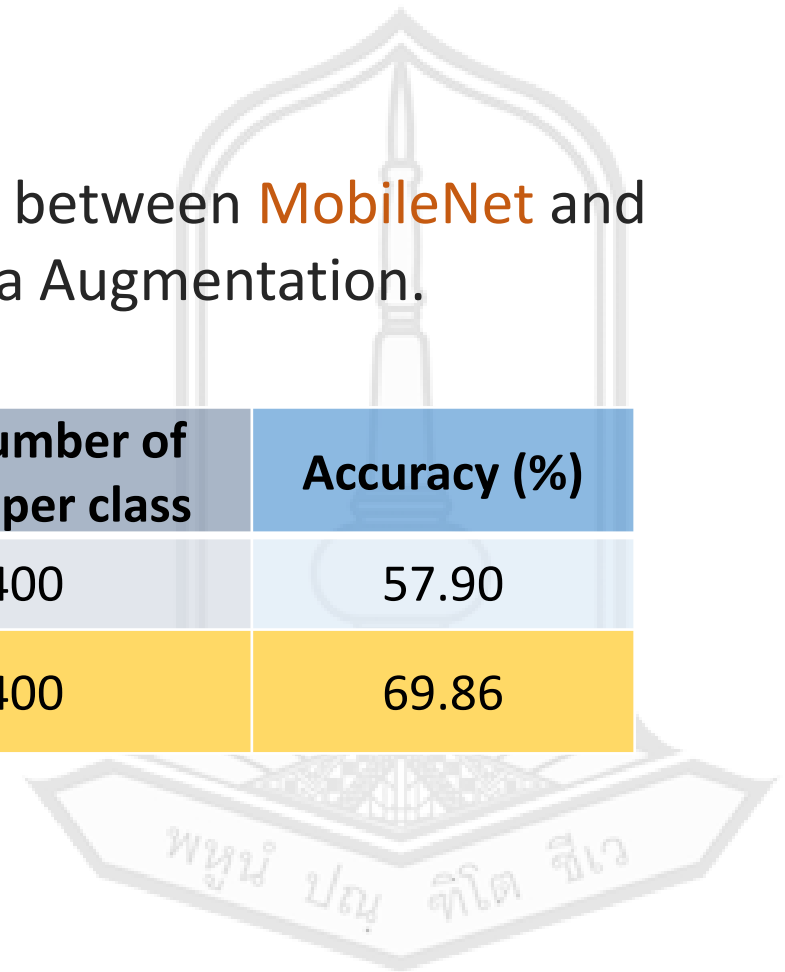


# EXPERIMENTAL & RESULTS

## Experimental Results

The performance results of food image classification between **MobileNet** and **improved MobileNet** architectures with Data Augmentation.

Method	The number of image per class	Accuracy (%)
Data Augmentation + MobileNet	400	57.90
Data Augmentation + improved MobileNet	400	69.86



# EXPERIMENTAL & RESULTS

## Experimental Results

The performance results of food image classification on **four subsets on ETH Food-101** dataset using the **proposed MobileNet architecture**.

Methods	Subsets of the EHT Food-101 dataset			
	I	II	III	IV
Without data augmentation	45.84	51.29	60.26	66.78
Random cropping	45.79	55.82	59.52	67.44
With data augmentation	48.71	56.71	62.49	69.86
With data augmentation + random cropping	51.39	59.68	65.97	<b>72.59</b>

# EXPERIMENTAL & RESULTS

## Experimental Results

The performance results of food image classification between the **proposed MobileNet architecture** and other previous methods

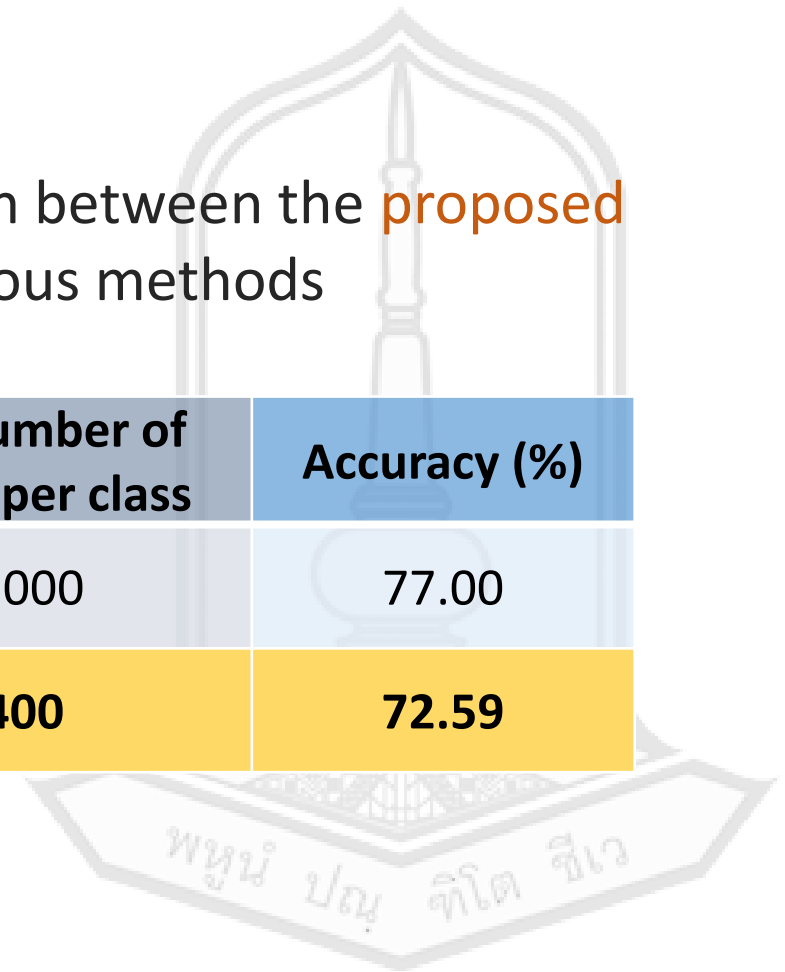
Method	The number of image per class	Accuracy (%)
Random Forest Discriminative Components	1,000	50.76
Supervised Extreme Learning Committee	1,000	55.89
Data Augmentation + Inception V3	1,000	70.41
FoodNet: Ensemble Net	1,000	72.10
<b>Our proposed (Data Augmentation + MobileNet)</b>	<b>400</b>	<b>72.59</b>

# EXPERIMENTAL & RESULTS

## Experimental Results

The performance results of food image classification between the **proposed MobileNet architecture** and other previous methods

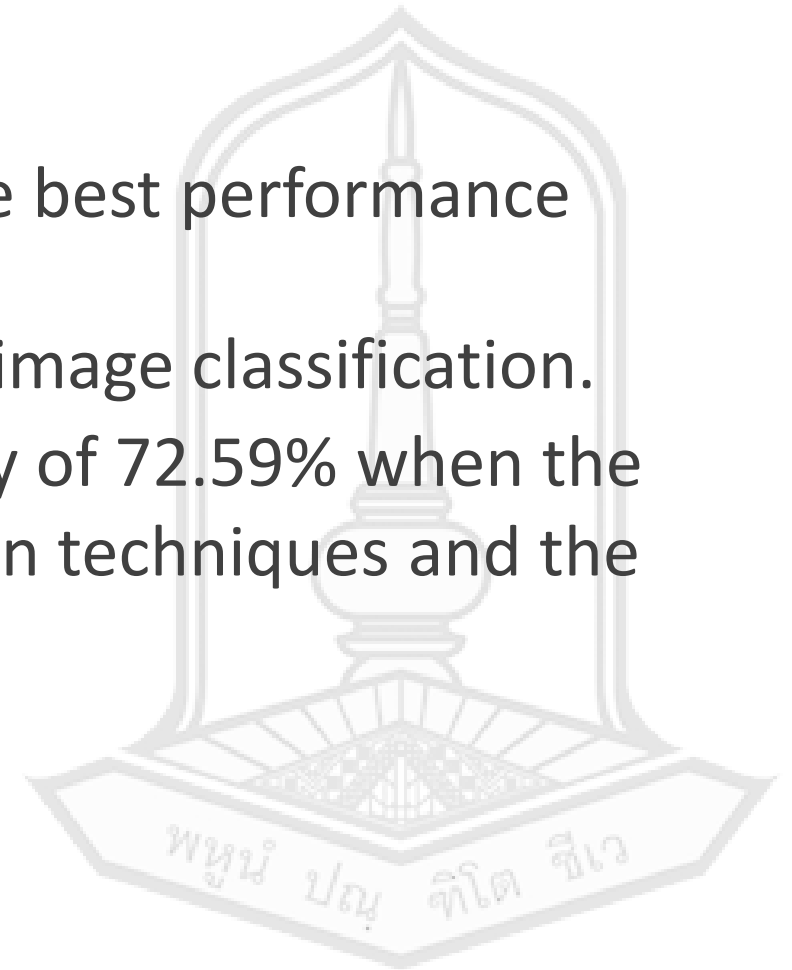
Method	The number of image per class	Accuracy (%)
DeepFood	1,000	77.00
<b>Our proposed (Data Augmentation + MobileNet)</b>	<b>400</b>	<b>72.59</b>





# CONCLUSION

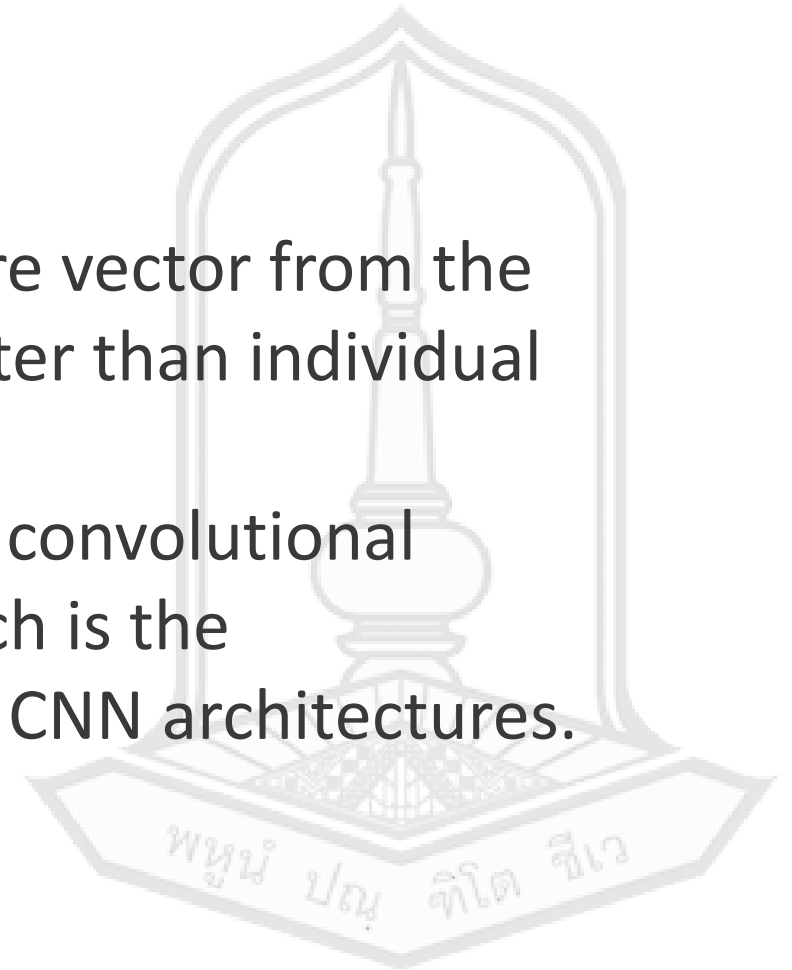
- ✓ The proposed MobileNet architecture is the best performance than the MobileNet architecture.
- ✓ The data augmentation are impact to food image classification.
- ✓ The best performance achieved an accuracy of 72.59% when the combination of the various data augmentation techniques and the proposed MobileNet architecture.



# CONCLUSION

## In future work

- We are interested in extracting the feature vector from the convolutional layers which may work better than individual deep CNN architecture.
- We plan to construct the deep ensemble convolutional neural network (CNN) architectures, which is the combination of the state-of-the-art deep CNN architectures.





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**THANK YOU FOR YOUR ATTENTION**

