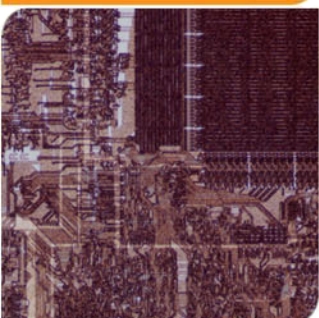
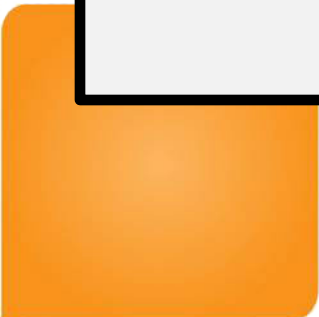


# Work-In-Progress: Video Analytics From Edge To Server



Jiashen Cao, Ramyad Hadidi, Joy Arulraj, Hyesoon Kim





# Motivation

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- ▶ Camera systems generate massive amount of data nowadays.
  - ▶ According to Lucid Motors, 6 – 12 cameras are able to produce 60 – 400 MB data per second.
  - ▶ It is no longer possible to analyze large-scale data by hands.
- ▶ The advancements in **deep neural networks** encourage engineers to use it to understand data without manual efforts.
- ▶ In a system, more devices (cameras, sensors) are deployed on the edge.
  - ▶ More computation resources are available on the edge.
  - ▶ Edge devices are usually under-utilized in the system.



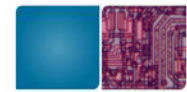
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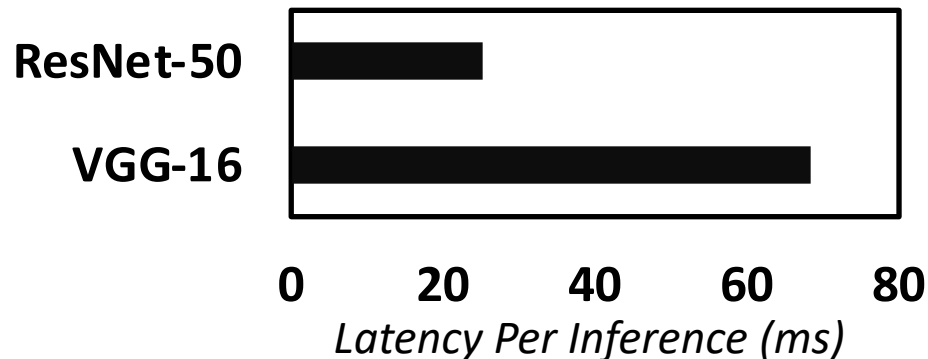
**Deep Neural Networks based System  
Processes Real-Time Inference On The Edge**

- ▶ In a system, more devices (cameras, sensors) are deployed on the edge.
  - ▶ More computation resources are available on the edge.
  - ▶ Edge devices are usually under-utilized in the system.



# Challenges

- ▶ Deep neural networks inferences are compute intensive.
  - ▶ VGG-16 model has 16 GFLOPs.
- ▶ Each edge device has limited computation resource.
  - ▶ A Nvidia TX2 development board.
    - 2 GHz ARM CPU processor and a low end GPU.
- ▶ As results,
  - ▶ Limited computation resource causes longer latency.

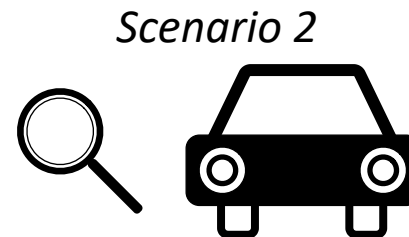




# Observation

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- ▶ In video analytics system, not all requests have the same accuracy requirements.
  - ▶ To identify the license plate number of a vehicle, the system needs to run deep neural network prediction with high accuracy.
  - ▶ To estimate number of cars passing a traffic intersection, the system requires lower accuracy support.



- ▶ Opportunities exist to leverage accuracy and improve the performance.

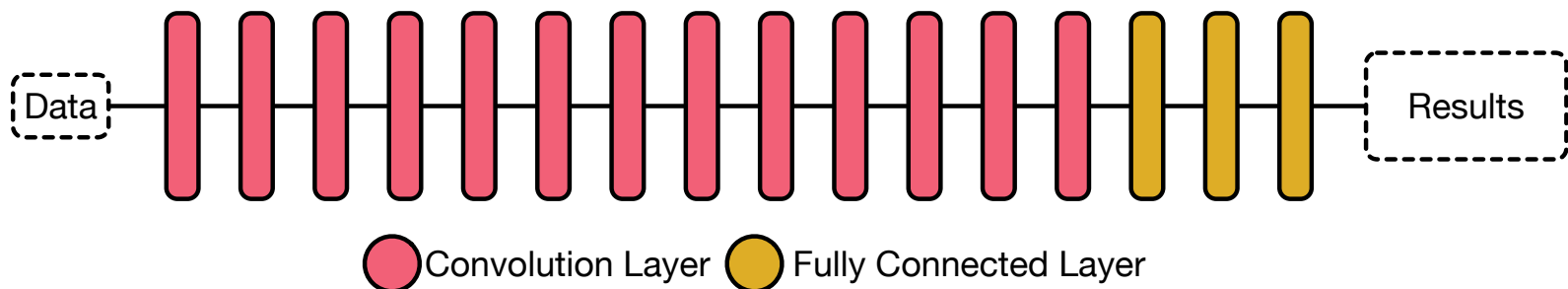


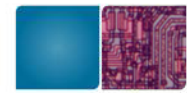
# Our Approach

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- ▶ A Multi-Stage Neural Network.
  - ▶ Support multiple accuracy requirements in a single model.
  - ▶ Stop in the middle of inference if accuracy requirements are met.
- ▶ Conduct case study on VGG-16.

*Original VGG-16*



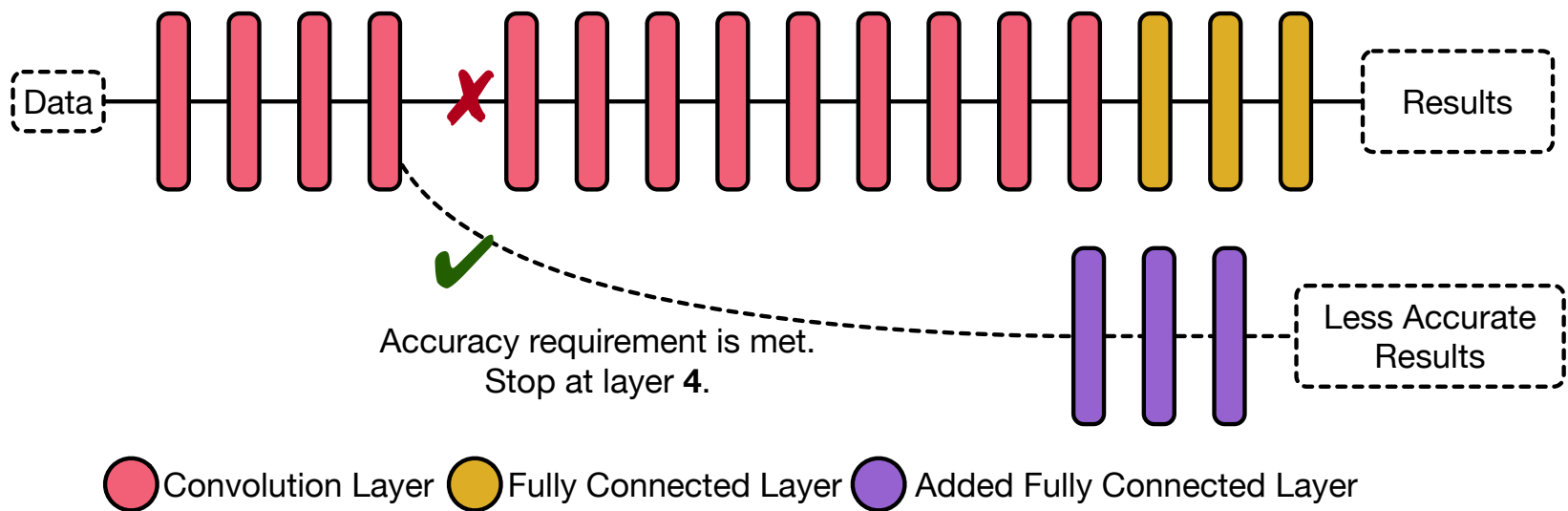


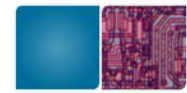
# Our Approach (cont'd)

7

- ▶ Multi-Stage VGG-16 properties.
  - ▶ Add customized fully connected layers to shallow convolution layers.
  - ▶ Inferences stop early if accuracy requirements are met.

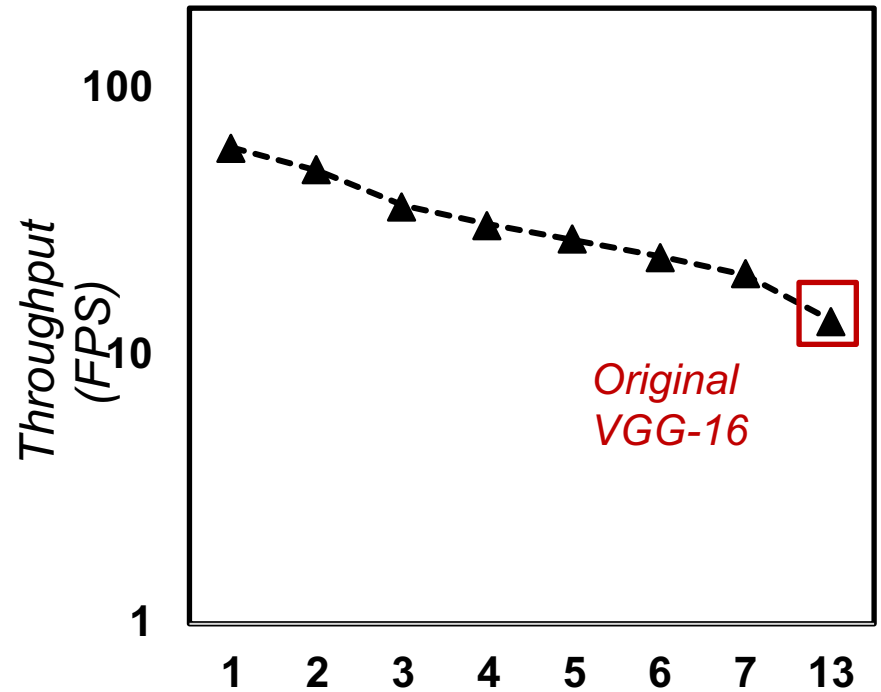
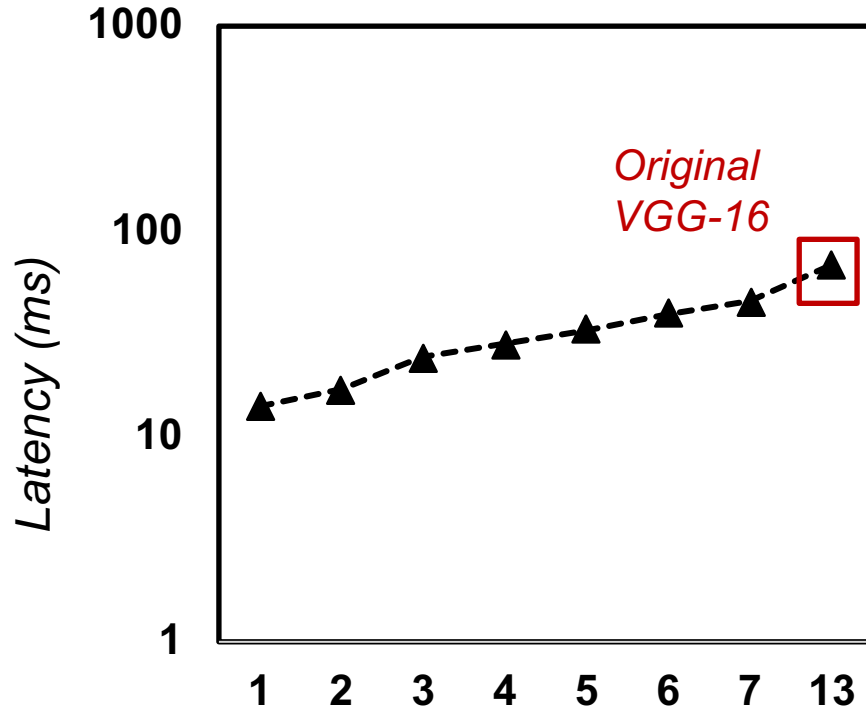
*An Example of Multi-Stage VGG-16*





# Preliminary Results

► Profile performances on Nvidia TX2.



Early Stop Layer #