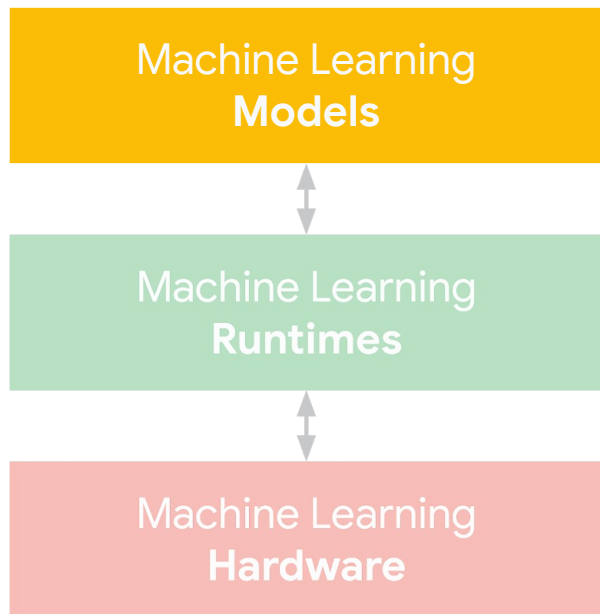


# What are the Challenges for TinyML?

Part D





# Model Compression Techniques

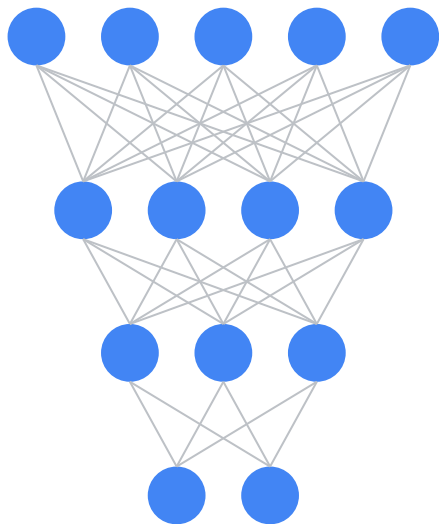
## **Pruning**

Quantization

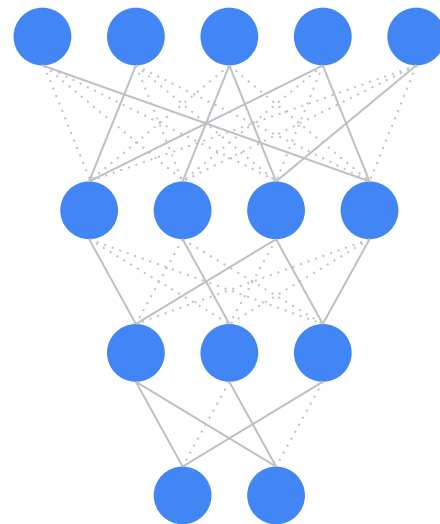
Knowledge Distillation

...

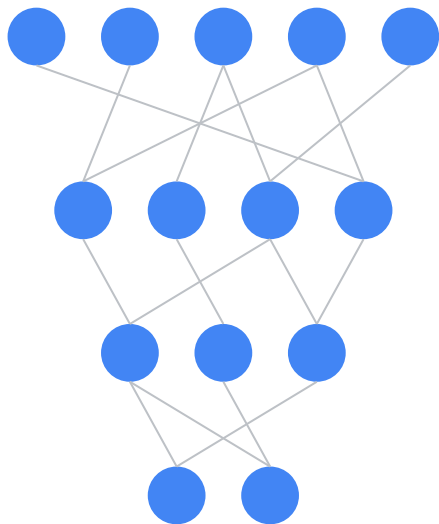
# Pruning



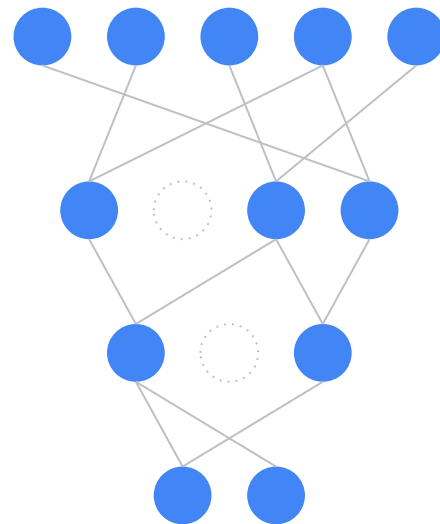
**PRUNING  
SYNAPSES**

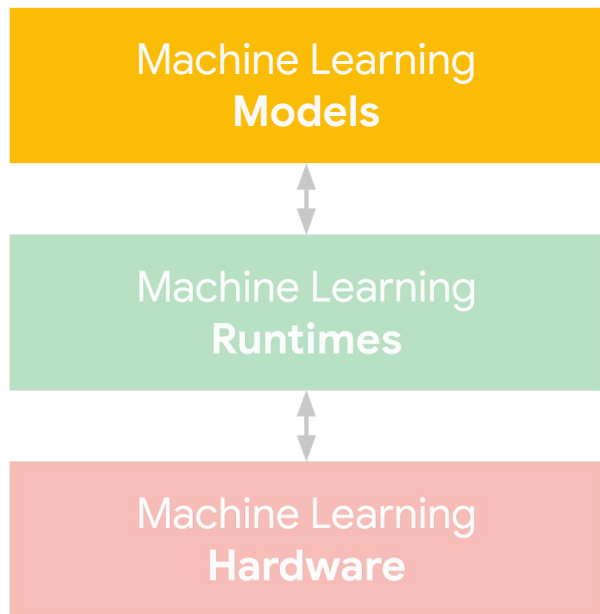


# Pruning



PRUNING  
NEURONS





# Model Compression Techniques

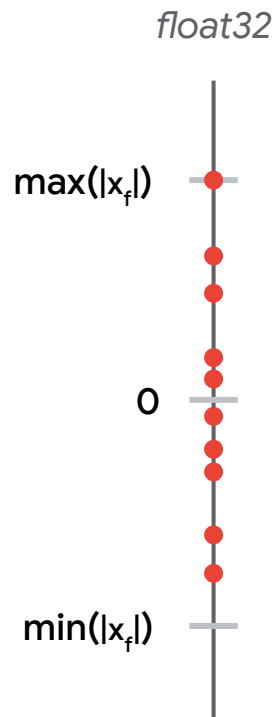
Pruning

**Quantization**

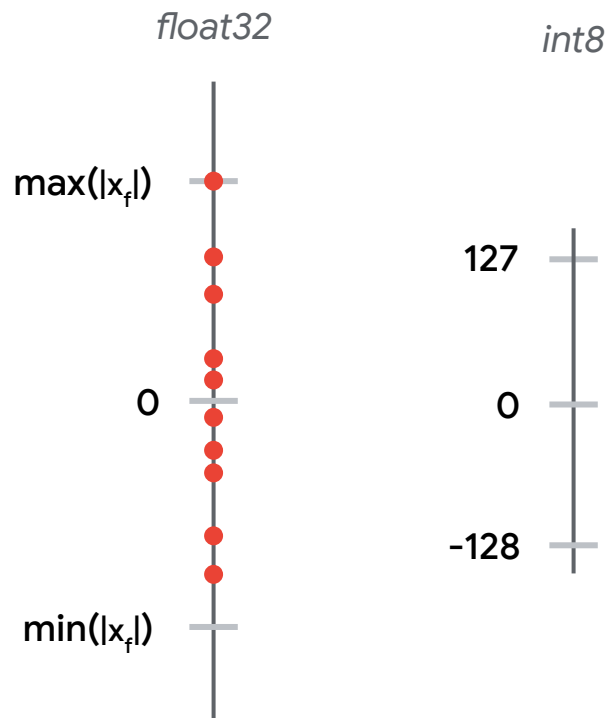
Knowledge Distillation

...

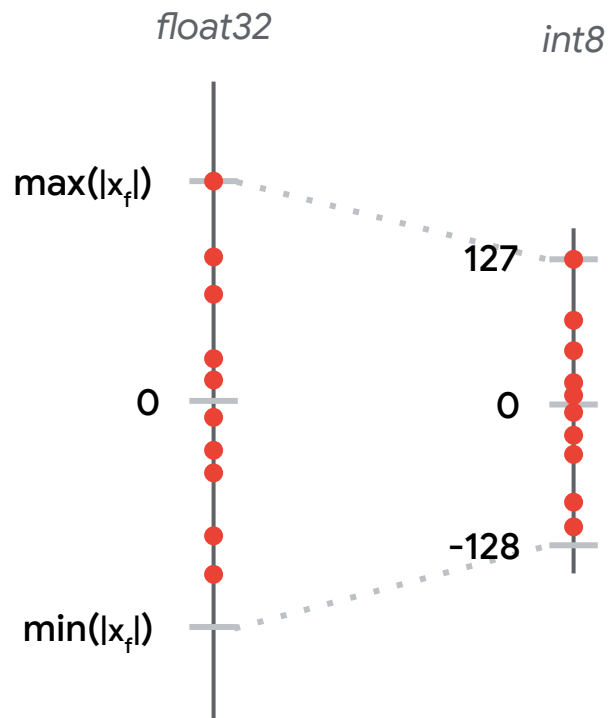
# Quantization



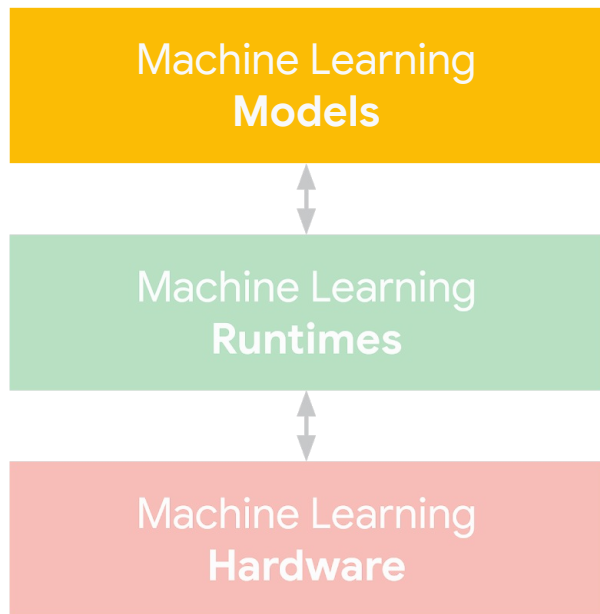
# Quantization



# Quantization







# Model Compression Techniques

Pruning

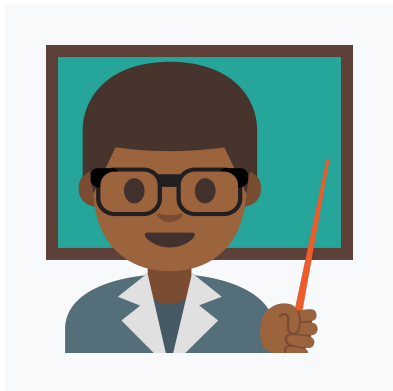
Quantization

**Knowledge Distillation**

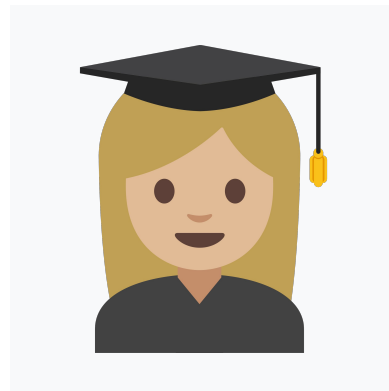
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# Knowledge Distillation

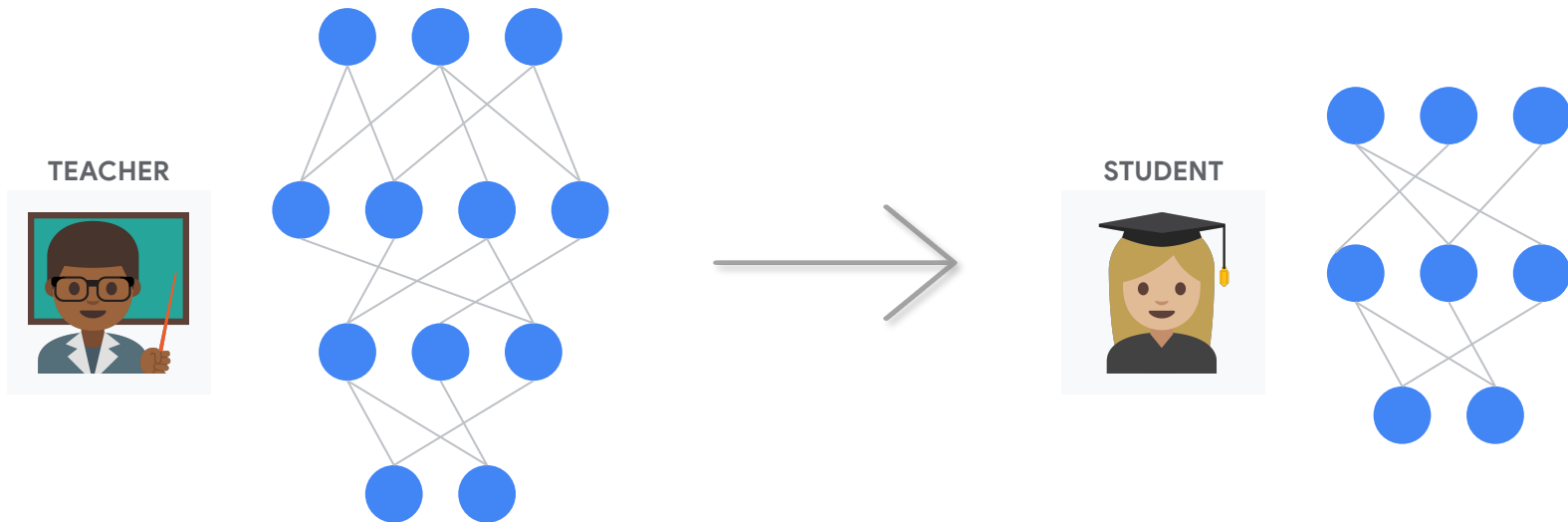
TEACHER

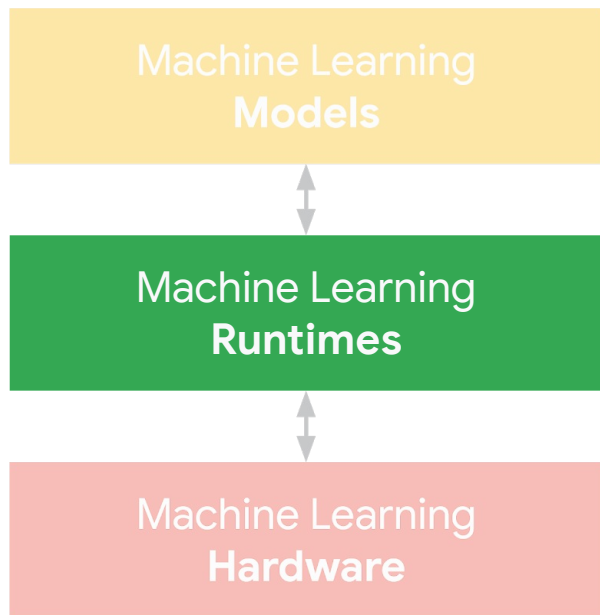


STUDENT



# Knowledge Distillation





# TensorFlow



**TensorFlow**



Less memory



Less compute power

Only focused on *inference*



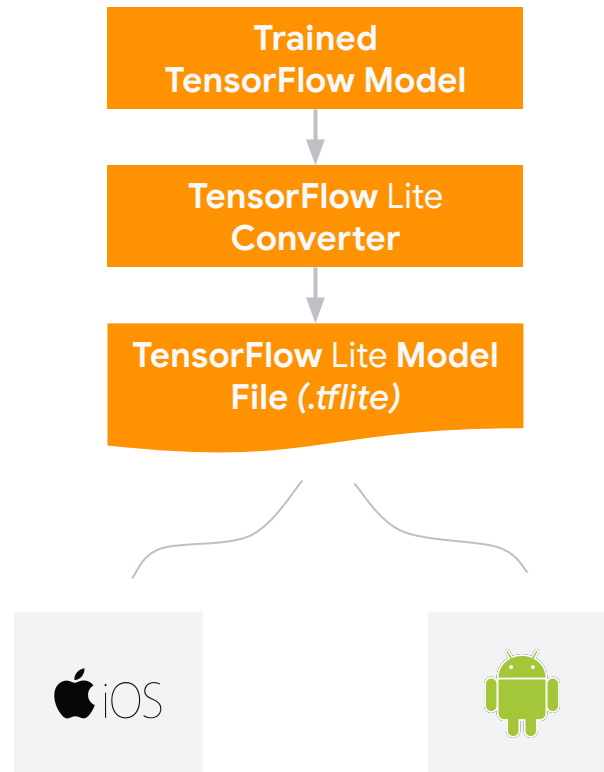
TensorFlow Lite

# Key Differences

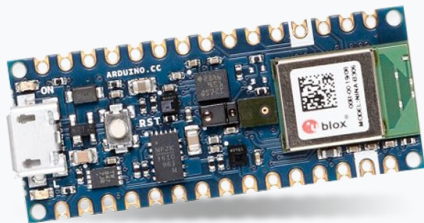
	 TensorFlow	 TensorFlow Lite
<b>Topology</b>	<b>Variable</b>	<b>Fixed</b>
<b>Weights</b>	<b>Variable</b>	<b>Fixed</b>
<b>Binary Size</b>	<b>Unimportant</b>	<b>High Priority</b>
<b>Distributed Compute</b>	<b>Needed</b>	<b>Not Needed</b>
<b>Developer Background</b>	<b>ML Researcher</b>	<b>Application Developer</b>



## Architecture



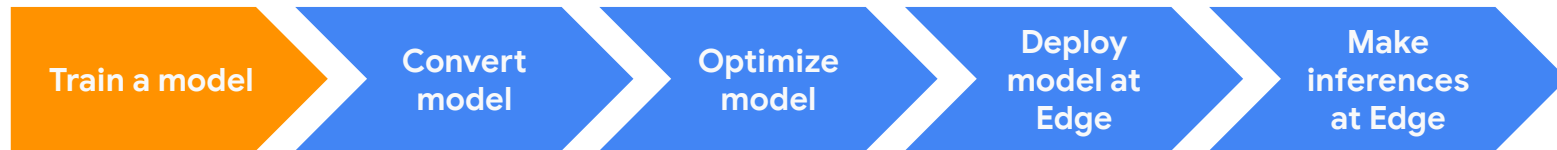
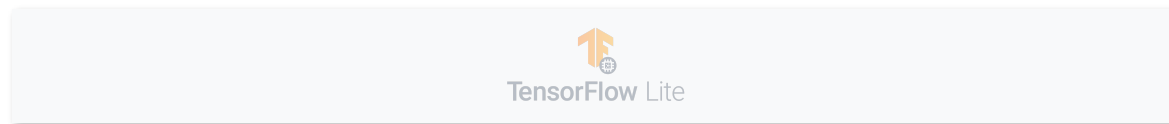
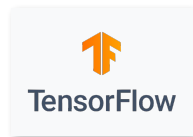




Even less memory

Even less compute power

Also, only focused on *inference*





Train a model

Convert  
model

Optimize  
model

Deploy  
model at  
Edge

Make  
inferences  
at Edge



Train a model

Convert  
model

Optimize  
model

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model at  
Edge

Make  
inferences  
at Edge



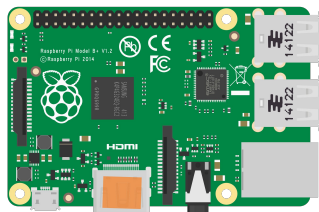
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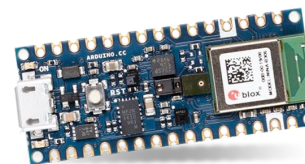
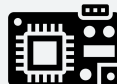
Raspberry Pi



Linux



iOS



Microcontroller



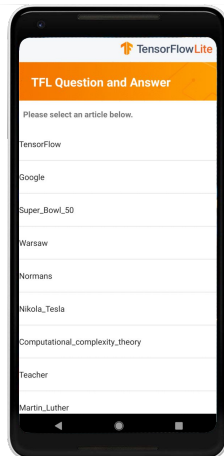
Train a model

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Optimize  
model

Deploy  
model at  
Edge

Make  
inferences  
at Edge





Machine Learning  
**Models**

Machine Learning  
**Runtimes**

Machine Learning  
**Hardware**