

# FPL 2019 - PhD Forum

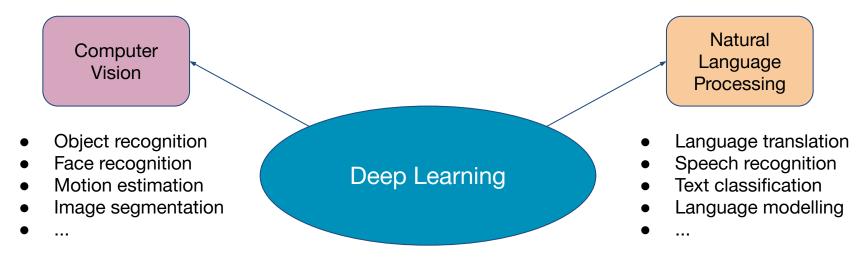
# FPGA Accelerated Deep Learning Radio Modulation Classification Using MATLAB System Objects & PYNQ

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#### Motivation

#### Impact of Deep Learning:

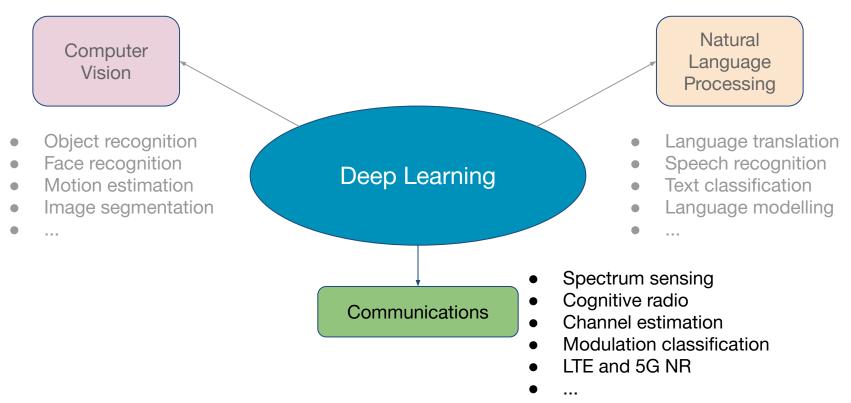




#### **Motivation**

#### Impact of Deep Learning:





#### Our Aim



# Develop a workflow for training, quantising, simulating and implementing CNNs for communications on Zynq

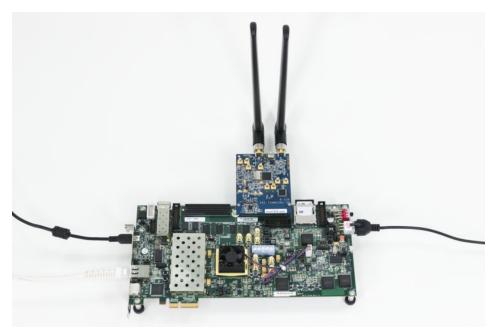


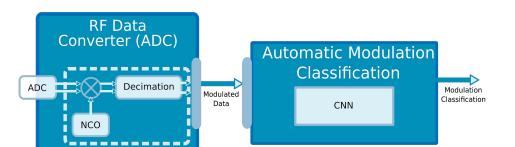




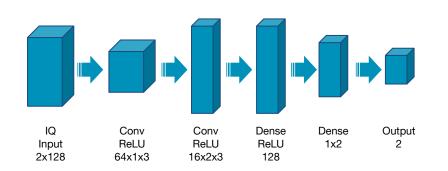
Figure 1. Credit Mathworks - Zynq SDR Support from Communications Toolbox

#### Application - Automatic Modulation Classification





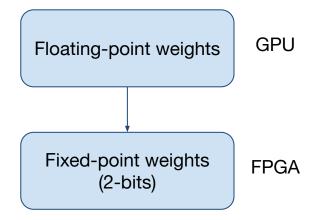
- Application for Spectrum Sensing
- Paper outlining this CNN structure by T. O'shea 2016
- Apply already proven structure and transfer it to hardware.
- Reduced modulation schemes to 2 for implementations simplicity



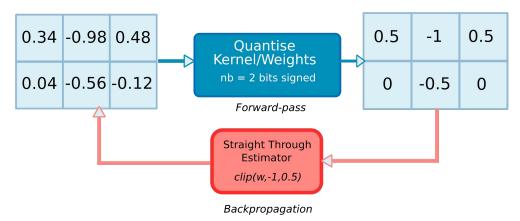
Layer #	Layer type	Neurons	Activations	MACs
1	Input	2*128	-	-
2	Conv	64*1*3	ReLU	48384
3	Conv	16*2*3	ReLU	761856
4	Dense	128	ReLU	253952
5	Dense	2	Softmax	256
6	Output	2	-	-

#### **Quantised CNN**





- Avoid quantising from trained floating-point weights
- Massive reduction in accuracy
  Altered our training process to train with quar
- Altered our training process to train with quantisation limitations



Example of kernel quantised training

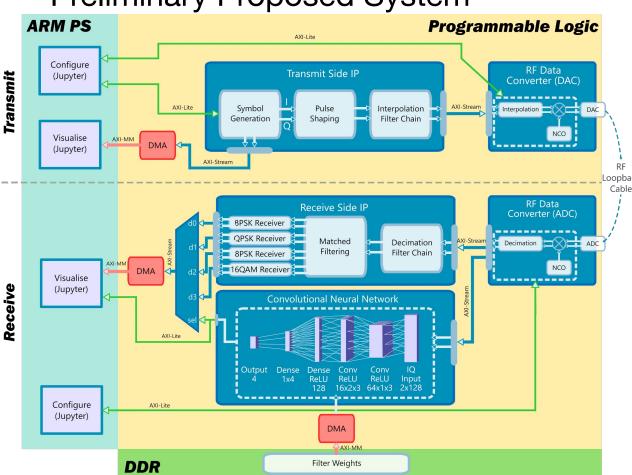
### **Quantised CNN**



#### Classification Accuracy (%)



Preliminary Proposed System





#### **RFSoC**

(Zyng UltraScale+ ZCU111 Evaluation Platform)

Single chip transmit/receive

#### **PYNQ**

- Python productivity on Zynq
- Dynamically change modulation scheme
- Visualise the CNN decision making in real-time

### **Proposed Workflow**



Train quantised weights



Load weights into MATLAB System Objects



Generate HDL with HDL Coder



Integrate with PYNQ overlay in Vivado

- Train quantised weights on DL frameworks
- Tensorflow/Keras
- PyTorch
- MATLAB Deep Learning Toolbox
- Configurable System Objects
- Adjustable CNN dimensions
- Simulate quantised network using Simulink

- Integrate with other MATLAB HDL IP
- Generate HDL for both CNN & communications applications
- Generate PYNQ bitstream for deployment
- Interface with Jupyter notebook



# Thank you!

Questions can be answered at the poster.

Feel free to come and discuss with us:)