



# Study and design of MRAM-based in-memory computing architectures for machine learning applications

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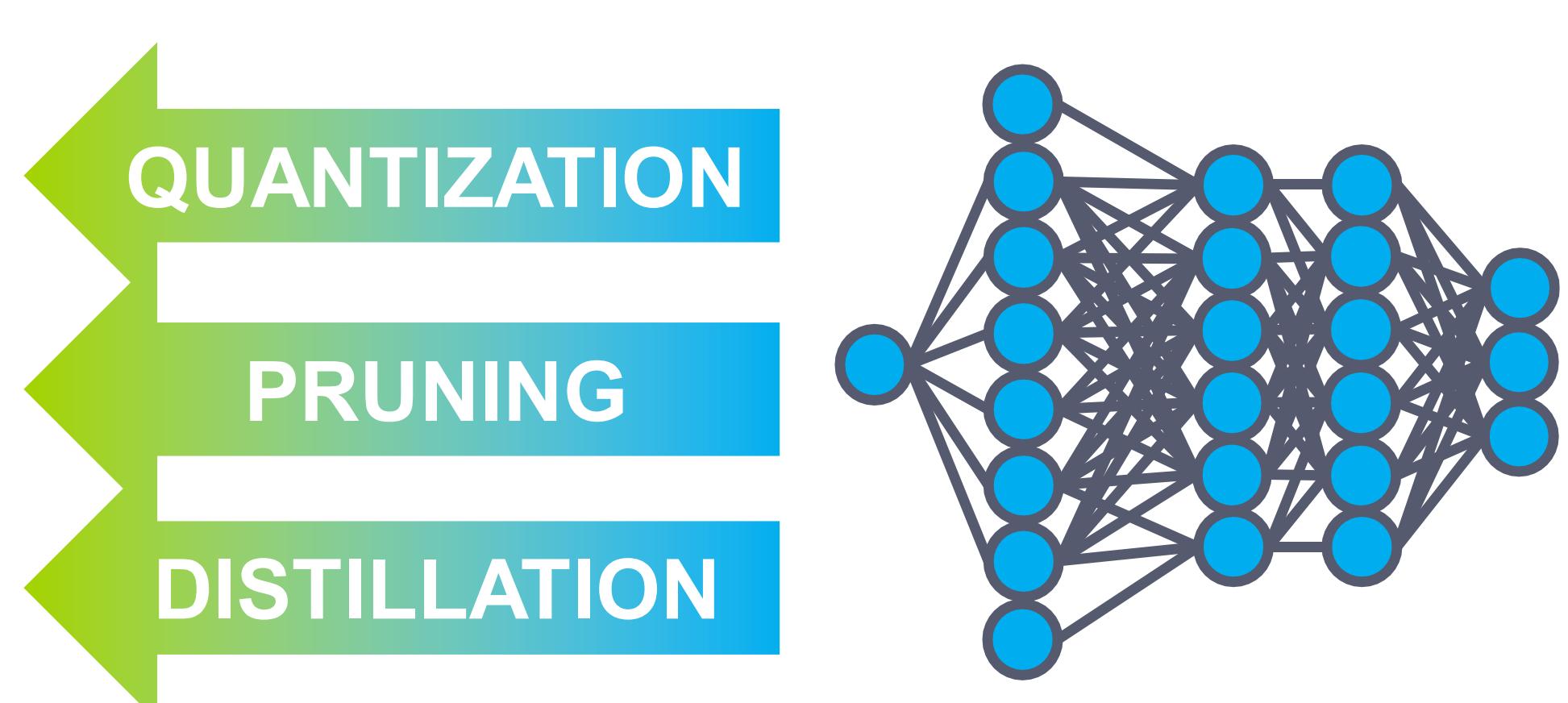


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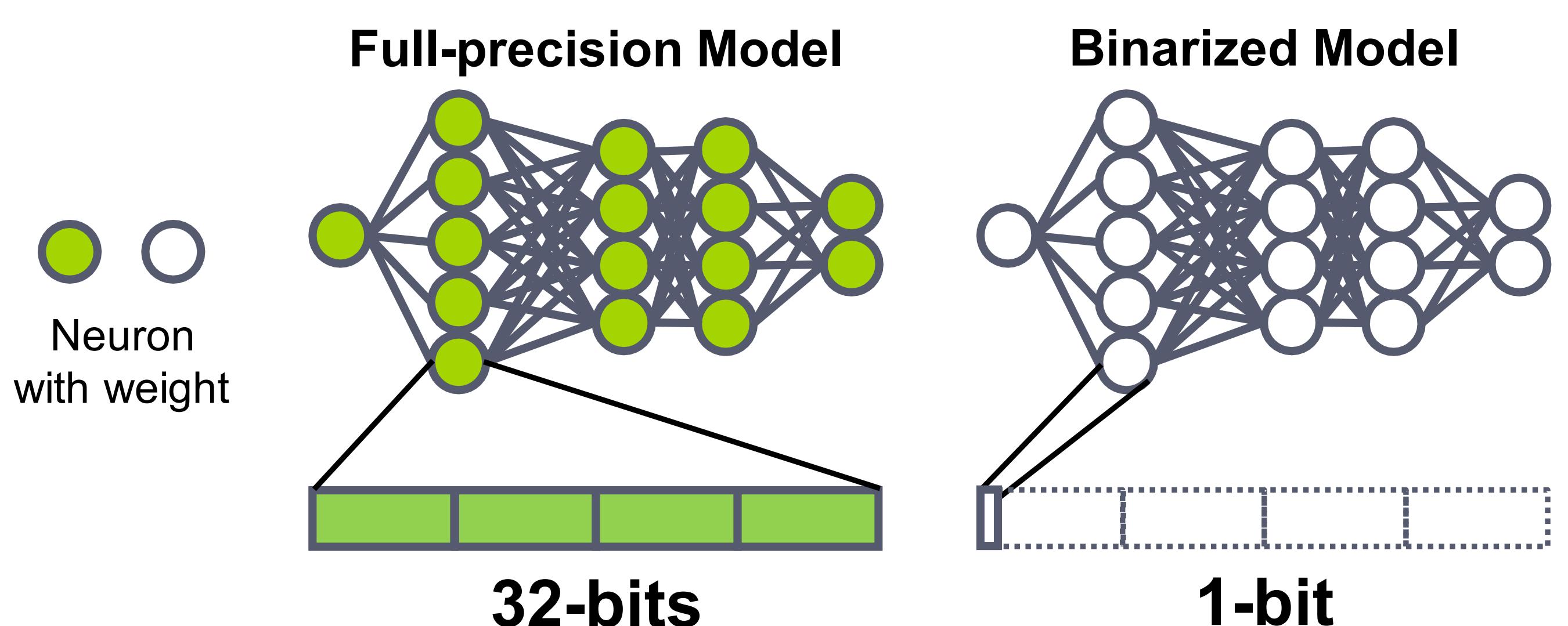
Bruno Lovison Franco<sup>1</sup>, Aymen Romdhane<sup>2</sup>, David Novo<sup>1</sup>, Pascal Benoit<sup>1</sup>, Guillaume Prenat<sup>2</sup>, Lorena Anghel<sup>2</sup>

## ① from regular ML models towards TinyML

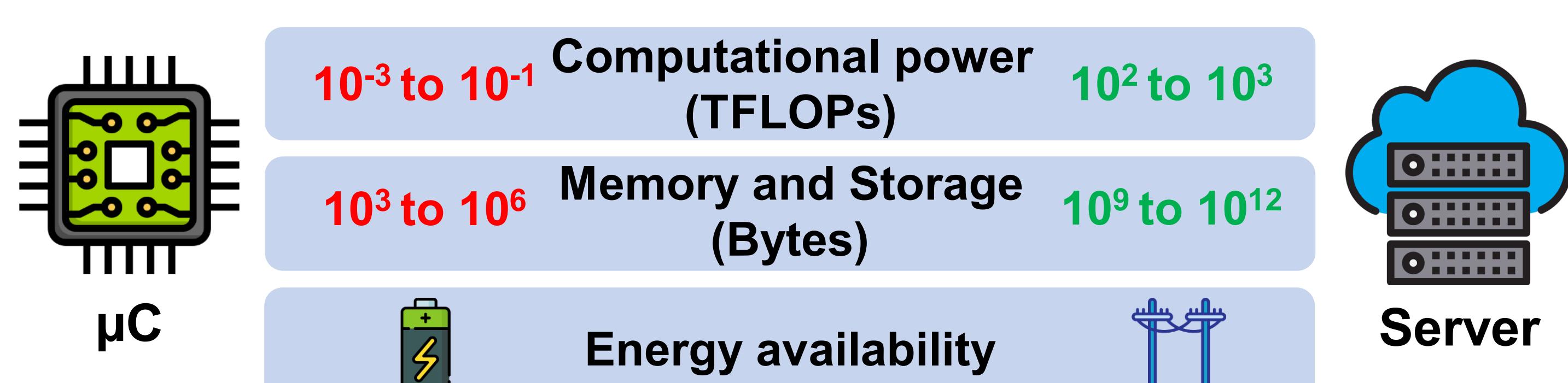
### TinyML Model



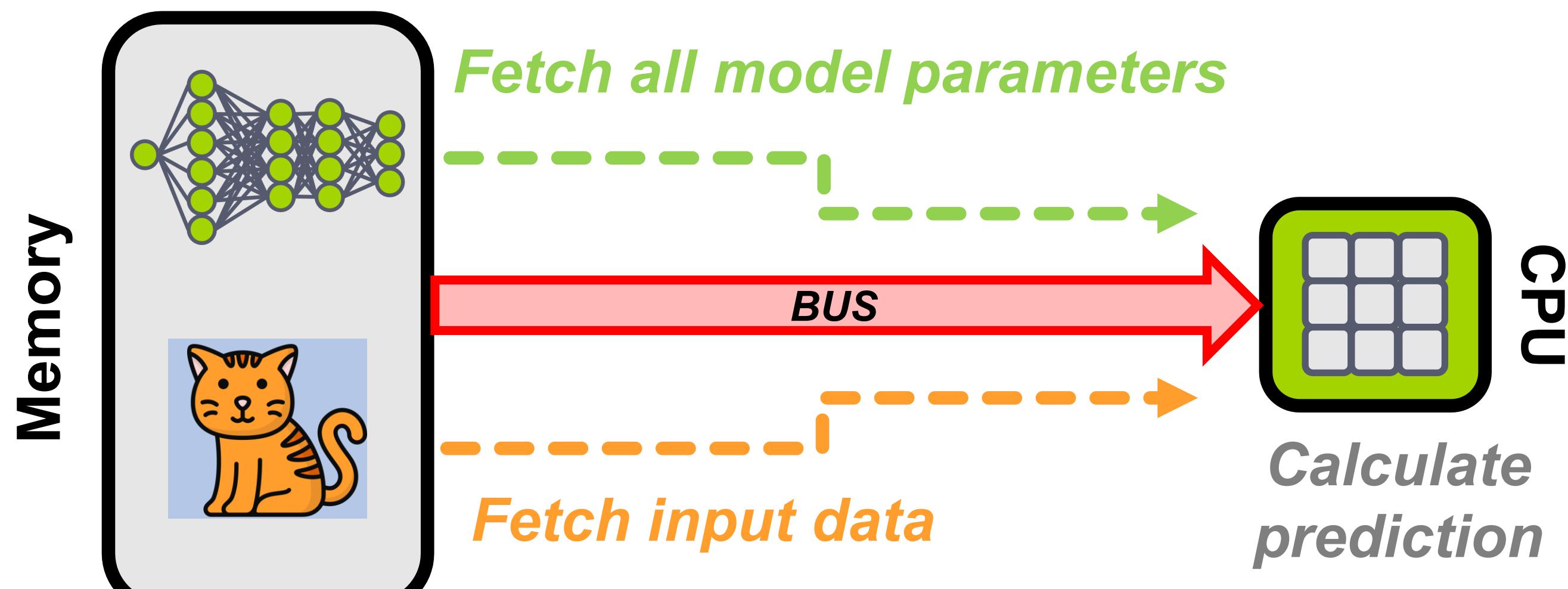
## ③ Binary Neural Networks & Ensembles



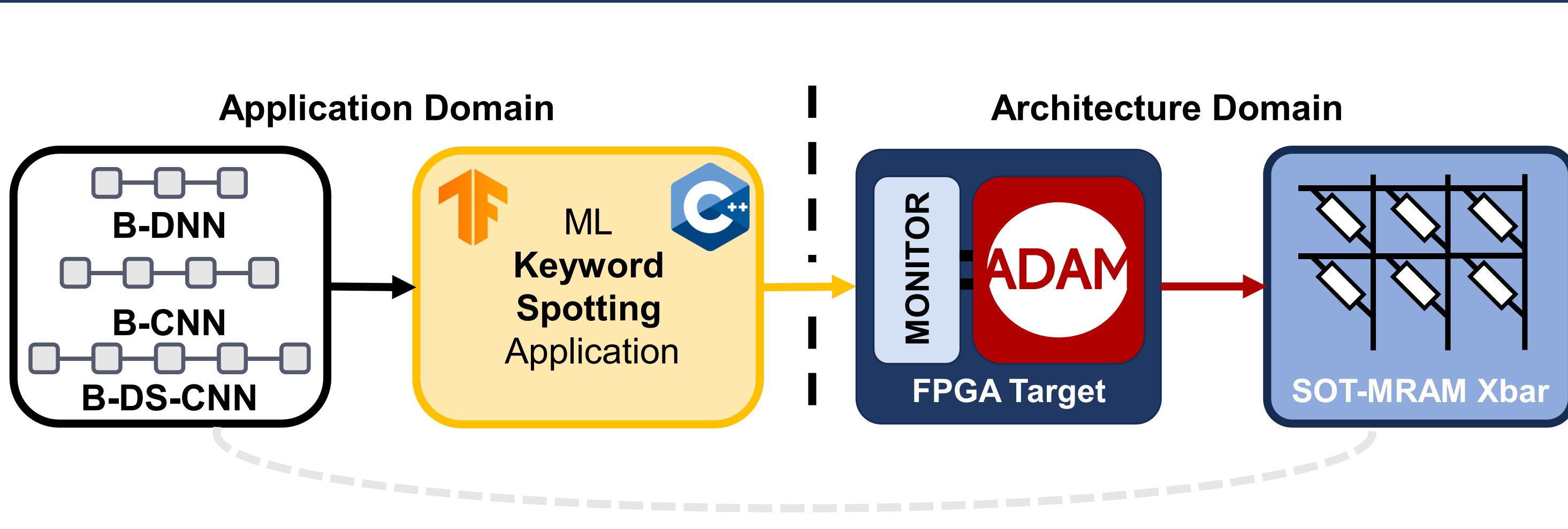
## ② Model Size, Data Movement and Operation Latency



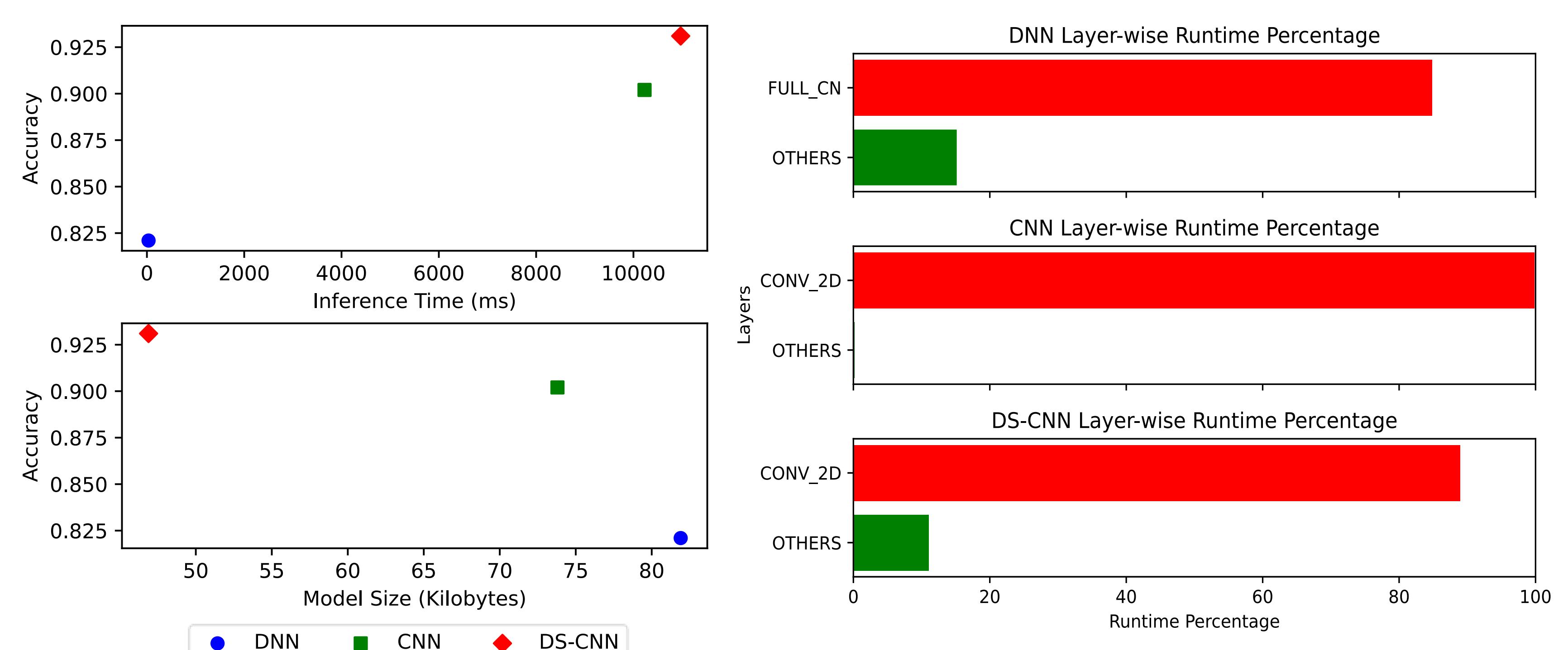
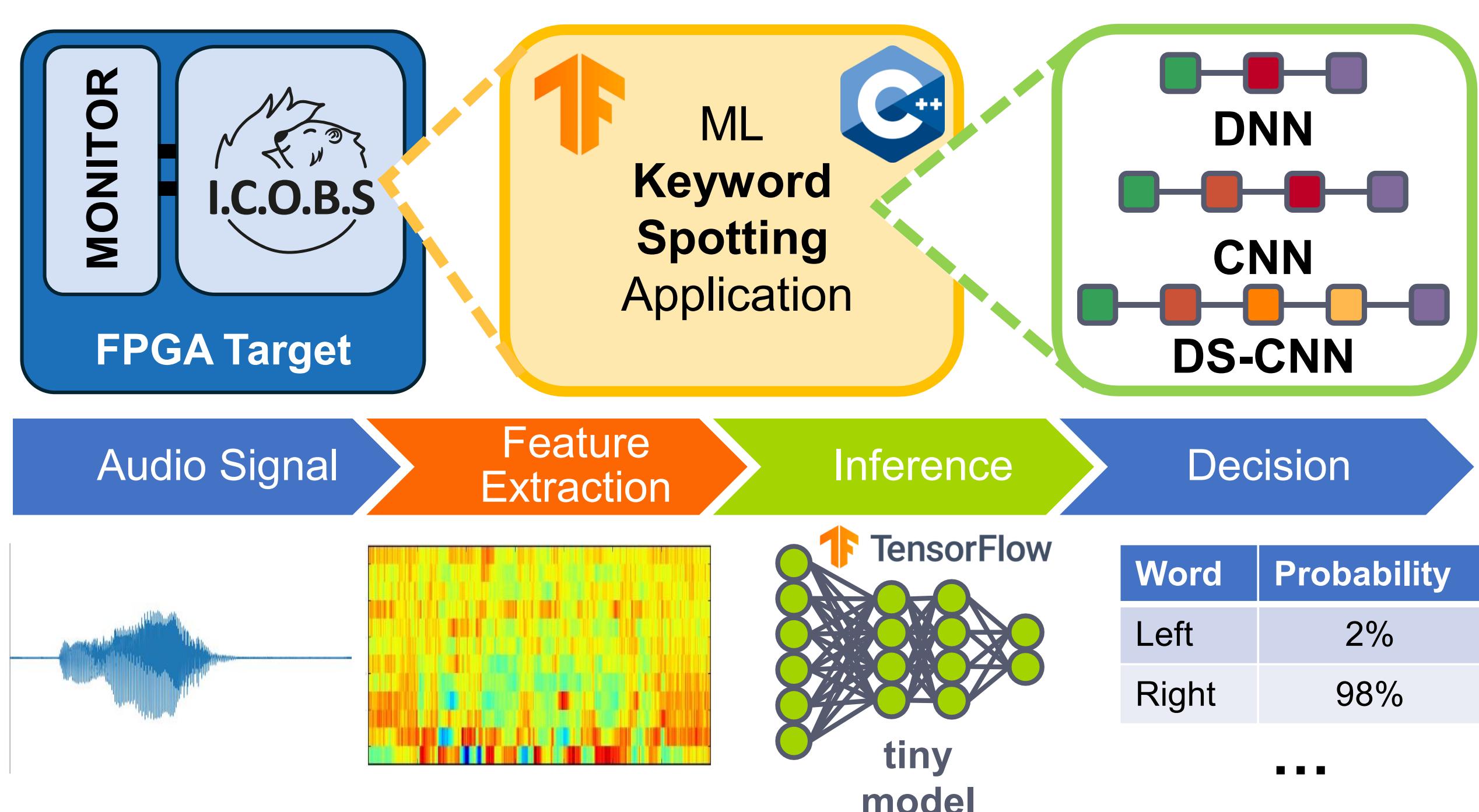
### Inference dataflow



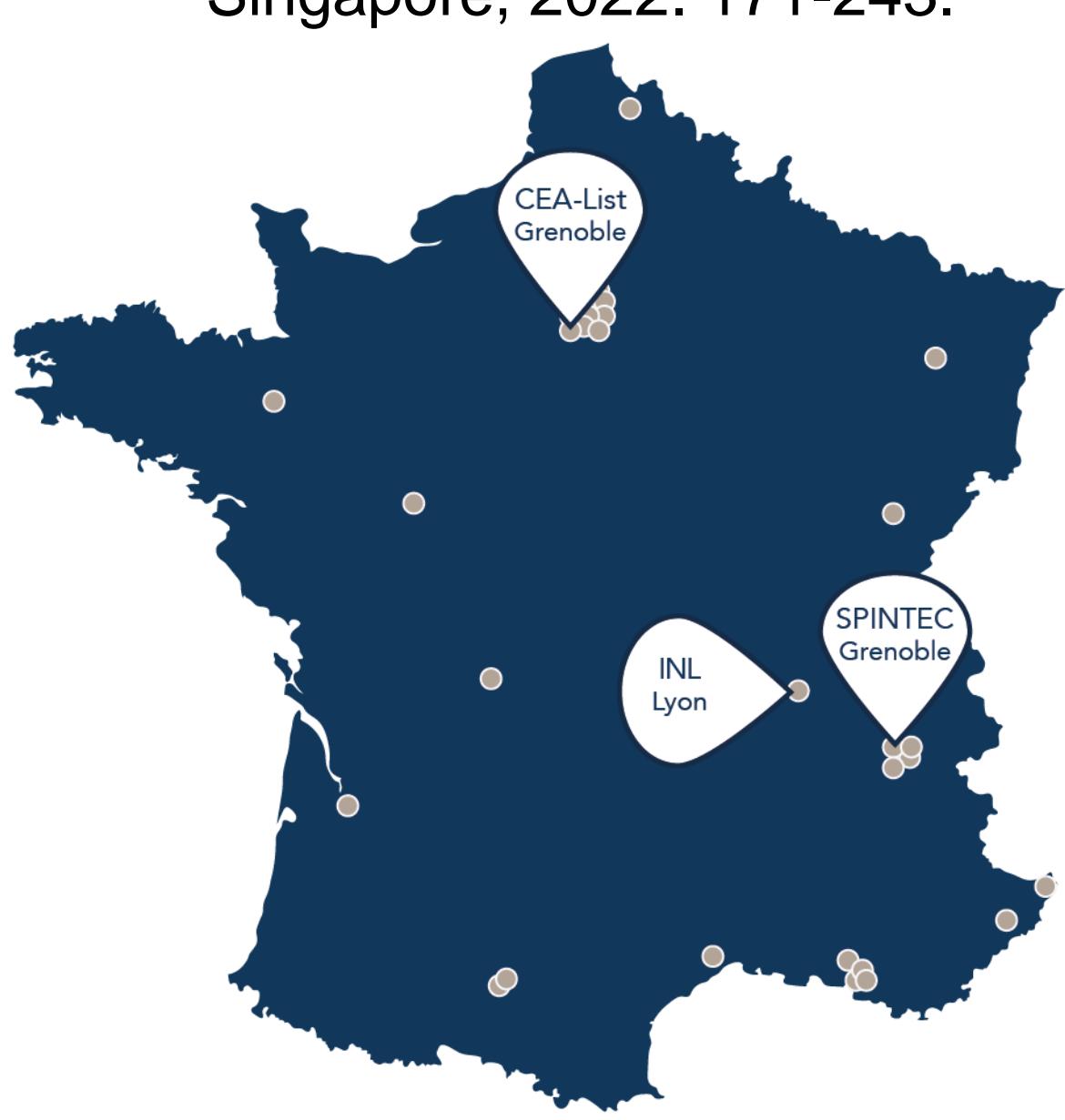
## ④ Network and Architecture Co-optimization



## ⑤ Keyword Spotting Application and Bottlenecks



1. Tchendjou, Ghislain Takam, et al. "Spintronic Memristor based Binarized Ensemble Convolutional Neural Network Architectures." IEEE Transactions on Computer-Aided Design of Integrated Circuits and Systems (2022).
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3. Mutlu, Onur, et al. "A modern primer on processing in memory." Emerging Computing: From Devices to Systems: Looking Beyond Moore and Von Neumann. Singapore: Springer Nature Singapore, 2022. 171-243.



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