Bayesian Neural Networks

Ava, Conor, & Taylor

Reed College

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A Brief History

The patent a 'Method of providing digital signatures' is filed by Ralph C. Merkle [merkle-patent].

The original patent expires.

Bitcoin uses Merkle Trees for 'block header commitment.' [friedent]

Twenty students taking a cryptography class.



Intro

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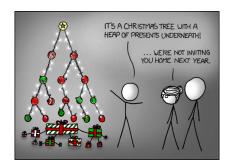


Figure: XKCD: "Tree" [xkcd-tree]

Merkle trees are secured data structures whose operations can be used to prove/verify membership of a node in $\mathcal{O}(\log(n))$ hashes.



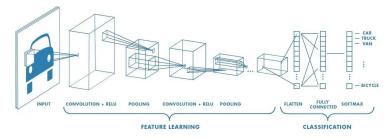
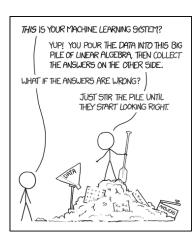


Figure: NEED NN PHOTO [5]

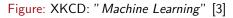


Issues with Neural Networks



Stir data and pray

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Convolutional Neural Networks (CNN)

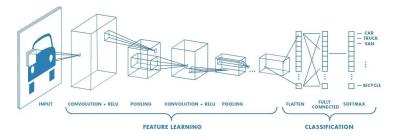


Figure: CNN pipeline [5]



Why we use CNNs

TO COMPLETE YOUR REGISTRATION, PLEASE TELL US WHETHER OR NOT THIS IMAGE CONTAINS A STOP SIGN:





ANSWER QUICKLY—OUR SELF-DRIVING CAR IS ALMOST AT THE INTERSECTION.

50 MUCH OF "AI" IS JUST FIGURING OUT WAYS TO OFFLOAD WORK ONTO RANDOM STRANGERS.

Figure: XKCD: "Self Driving" [4]

- They are more efficient for image based tasks
- Channels...



Difference between BNNs and CNNs

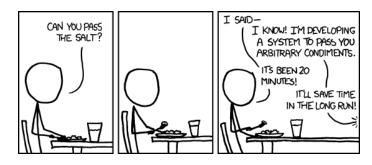


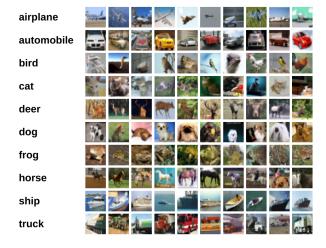
Figure: XKCD: "The General Problem" [2]

The relationship between BNNs and BCNNs is the same as NNs and CNNs.



Neural Networks Bayesian Neural Networks Simulation Reference
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CIFAR-10







Simulation

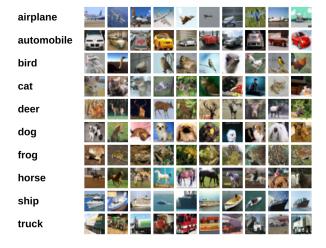
Hyperparameters

Hyperparameter	CNN	BCNN
Epochs	500	500
Learning Rate		May be higher (0.01 - 0.1) due to simpler structure
Regularization	L1/L2 weight decay or Dropout common to prevent overfitting	Can benefit from Dropout, but weight decay might be less crucial
Optimizer	Adamw	Adamw



Neural Networks Bayesian Neural Networks Simulation Reference
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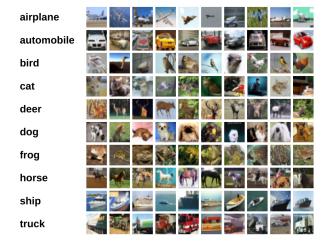
Results







Confusion Matric







References I

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