Assignment 1

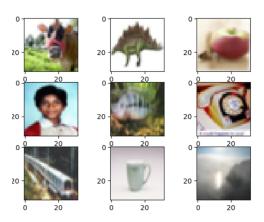
David Gardner
Boston University
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June 2, 2025

Dataset: CIFAR-100

100 classes of 32x32 color photorealistic images from the internet.

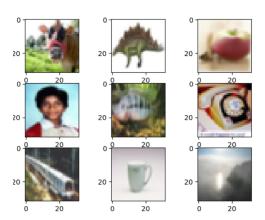
1. 80 Million Tiny Images dataset in 2008



Dataset: CIFAR-100

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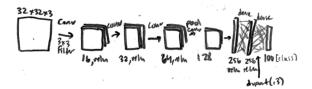
- 1. 80 Million Tiny Images dataset in 2008
- 2. Alex Krizhevsky labeled 6,000 in 2009 Krizhevsky 2009



Methods

Matching existing implementation

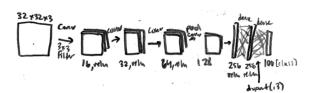
"Learning Multiple Layers of Features from Tiny Images"
 (2007)



Methods

Matching existing implementation

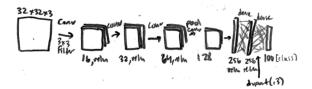
- "Learning Multiple Layers of Features from Tiny Images" (2007)
 - (i) Whitening
 - (ii) Restricted Boltzmann Machine (RBM)



Methods

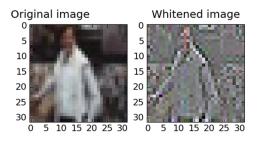
Matching existing implementation

- "Learning Multiple Layers of Features from Tiny Images" (2007)
 - (i) Whitening
 - (ii) Restricted Boltzmann Machine (RBM)
- 2. Architecture from Geeks4Geeks, Assignment 0



Methods: Whitening

Prevents the model from focusing on irrelevant information Wiesler et al. 2014.



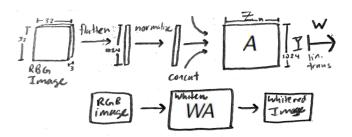
Credit: Alex Krizhevsky

Methods: Whitening

The sample covariance matrix of Y given n samples is

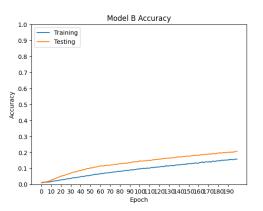
$$C = \frac{1}{n-1} A A^T.$$

We want to find W such that the sample covariance matrix of $W\!A$ is the identity matrix.



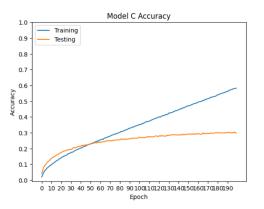
Experiments: Model B (Assignment 0)

200 epochs, 32 batch size — accuracy: 20.7% (ok...)



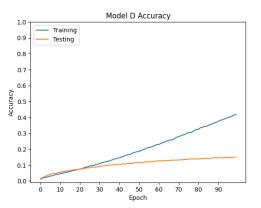
Experiments: Model C (Geeks4Geeks, Original)

200 epochs, 32 batch size — accuracy: 30.4% (overfitting)



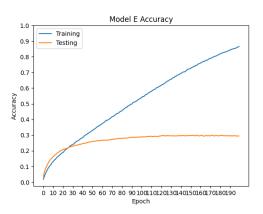
Experiments: Model D (Geeks4Geeks, Whitened)

200 epochs, 32 batch size — accuracy: 15.2% (whitening hurt performance)



Experiments: Model E (Geeks4Geeks, Batch Normalizations)

200 epochs, 32 batch size — accuracy: 29.6% (overfitting!!)



Discussion

Matching existing implementation

1. Whitening, batch normalization doesn't always help.

Discussion

Matching existing implementation

1. Whitening, batch normalization doesn't always help.

Discussion

Matching existing implementation

- 1. Whitening, batch normalization doesn't always help.
- 2. Different architectures to include whitening

Bibliography

- Krizhevsky, Alex (2009). Learning Multiple Layers of Features from Tiny Images. Technical Report. https://www.cs.toronto.edu/kriz/learning-features-2009-TR.pdf. Toronto, ON, Canada: University of Toronto.
- Wiesler, Simon et al. (2014). "Mean-normalized stochastic gradient for large-scale deep learning". In: 2014 IEEE International Conference on Acoustics, Speech and Signal Processing (ICASSP), pp. 180–184. DOI: 10.1109/ICASSP.2014.6853582.