

Critique Notes: Claude Transcript Analysis
Project 2: AI-Assisted Weight Initialization
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What Claude Got Right

1. Orthogonal Initialization:

- Said orthogonal matrices keep lengths the same: $||Wx|| = ||x||$
- Said all singular values are 1
- Said condition number is 1
- Gave correct method: use QR decomposition

2. Gaussian Initialization:

- Gave Xavier formula: $\sigma^2 = 2/(d_{in} + d_{out})$
- Gave He formula: $\sigma^2 = 2/d_{in}$
- Explained the math: to keep variance, need $d \cdot \sigma^2 = 1$

3. Uniform Initialization:

- Gave correct formula: $a = \sqrt{3/d}$
- Said variance = $a^2/3$
- Explained uniform matches Gaussian variance

What Claude Got Wrong

1. Big Mistake: $\sigma = 1/d$:

- Claude said $\sigma = 1/d$ would preserve variance
- Our tests showed this is completely wrong
- With $\sigma = 1/d$, variance drops to 0%
- Gradients vanish completely

2. Confusing Recommendations:

- Gave three different σ values without saying which to use
- $\sigma = 1/d$ (0.01), $\sigma = 1/\sqrt{d}$ (0.1), $\sigma = \sqrt{2/d}$ (0.1414)
- No clear guidance on which is best

3. Small Errors:

- Some math formulas were written poorly
- Said to scale orthogonal matrices by gain g , but if $g \neq 1$, they're not orthogonal anymore
- Some typos in the equations

What Claude Was Partly Right About

1. Uniform initialization stability:

- Said bounded range $[-a, a]$ is more stable
- Our tests showed uniform works similarly to Gaussian $\sigma=1/\sqrt{d}$
- But not necessarily "more stable" in our linear network

2. All methods aim for stability:

- True, but they achieve it very differently
- Orthogonal: exact mathematical guarantee
- Gaussian/Uniform: statistical, only works on average

Our Test Results vs Claude's Claims

1. Orthogonal: Claude was 100% right
 - Condition number = 1.000
 - Singular values all 1.000
 - Gradients preserved exactly
2. Gaussian $\sigma=1/d$: Claude was 100% wrong
 - Claude said: preserves variance
 - Our test: 0% preservation (So wrong)
 - Gradients vanished to near zero
3. Gaussian $\sigma=1/\sqrt{d}$: Claude was right
 - Claude said: preserves variance
 - Our test: 100.4% preservation
4. Uniform: Claude was mostly right
 - Claude said: matches Gaussian variance
 - Our test: 97.7% preservation
 - Performs similarly to Gaussian $\sigma=1/\sqrt{d}$

Overall Assessment

So Claude was almost right except for one major mistake

The main problem is Claude said $\sigma = 1/d$ would work, but it fails completely. This could mislead someone into using a bad initialization.

We can say as a conclusion that we need to always test AI math advice. The AI can give good starting points but can make serious mistakes that need checking.