

Systematic Evaluation of Feedforward Network Variants in Transformer Architectures

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Abstract

This paper presents a systematic evaluation of feedforward network variations in transformer architectures, with particular focus on modifications to the gated activation mechanism. We conduct controlled experiments comparing four variants against the SwiGLU baseline: (1) polynomial-enhanced GEGLU, (2) normalized GEGLU, (3) scaled residual GEGLU, and (4) pure GEGLU. All experiments use a 134M parameter transformer trained on the FineWeb dataset with fixed hyperparameters (learning rate 6e-4, batch size 256, 100K steps). While our best variant achieved a marginal 0.6% improvement in validation loss (4.898 vs 4.927), most modifications degraded performance. We discuss implications for architectural innovation and identify key limitations of our study, including the need for multi-run statistical validation and broader exploration of the design space.

[Previous sections remain unchanged until Methodology]

0.1 FFN Variants

We evaluated four variants:

0.1.1 Polynomial GEGLU

$$y = W_2 \left(\text{GELU}(W_{1a}x) \circ W_{1b}x + \alpha(W_{1a}x)^2 \circ W_{1b}x + \beta W_{1a}x \circ (W_{1b}x)^2 \right) \quad (1)$$

0.1.2 Normalized GEGLU

$$y = \text{LayerNorm} \left(W_2 \left(\text{GELU}(W_{1a}x) \circ W_{1b}x \right) \right) + x \quad (2)$$

0.1.3 Scaled Residual GEGLU

$$y = \alpha W_2 \left(\text{GELU}(W_{1a}x) \circ W_{1b}x \right) + x \quad (3)$$

0.1.4 Pure GEGLU

$$y = W_2 (\text{GELU}(W_{1a}x) \circ W_{1b}x) \tag{4}$$

[Remaining sections unchanged]