

# Method1

Attention处残差连接与原始模型相同。修改MLP处的残差为先前层重算的MLP输出累加。先前层MLP输出的重算方法为：

- 保留第一次Attention计算的 $\text{attn\_weights}$ ,  $W^V.\text{weight}$ ,  $W^O.\text{weight}$ , 仅更换输入嵌入矩阵X
- 输入嵌入X做input\_norm
- Attention重算
- Attention残差连接
- post\_attn\_layernorm
- MLP计算
- MLP计算结果不做残差连接直接输出, 作为重算后的MLP输出

# Method2

MLP处残差连接与原始模型相同。修改Attention处的残差为先前层重算的Attention输出累加。先前层Attention输出的重算方法为：

- 保留第一次Attention计算的 $\text{attn\_weights}$ ,  $W^V.\text{weight}$ ,  $W^O.\text{weight}$ , 仅更换输入嵌入矩阵X
- 输入嵌入X做input\_norm
- Attention重算
- Attention重算结果不做残差连接直接输出, 作为重算后的Attention输出

即：Method1\_v3与Method2\_v3的差别为：残差连接的修改位点不同，先前层输出重算的截止位置不同（截至MLP输出/截至Attention输出）

# Method3

与Method1基本相同，唯一不同之处在于MLP处残差和进行了归一化，且每一层的权重分布为 $1/m$ (Method 3.1)或可学习权重(Method3.2)

# Method4

与Method2基本相同，唯一不同之处在于Attention处残差和进行了归一化，且每一层的权重分布为 $1/m$ (Method 4.1)或可学习权重(Method4.2)

# Baseline

```
***** eval metrics *****  
epoch = 5.0  
eval_accuracy = 0.4966  
eval_loss = 2.5789  
eval_perplexity = 13.1821  
eval_runtime = 0:00:03.86  
eval_samples = 143  
eval_samples_per_second = 36.969  
eval_steps_per_second = 4.653
```

# Method1

```
***** eval metrics *****  
epoch = 5.0  
eval_accuracy = 0.5025  
eval_loss = 2.5259  
eval_perplexity = 12.5021  
eval_runtime = 0:00:06.32  
eval_samples = 143  
eval_samples_per_second = 22.595  
eval_steps_per_second = 2.844
```

# Method2

\*\*\*\*\* eval metrics \*\*\*\*\*

epoch = 5.0

eval\_accuracy = 0.4966

eval\_loss = 2.5748

eval\_perplexity = 13.1291

eval\_runtime = 0:00:05.53

eval\_samples = 143

eval\_samples\_per\_second = 25.826

eval\_steps\_per\_second = 3.251

# Method3.1

\*\*\*\*\* eval metrics \*\*\*\*\*

epoch = 5.0

eval\_accuracy = 0.5029

eval\_loss = 2.5252

eval\_perplexity = 12.494

eval\_runtime = 0:00:06.31

eval\_samples = 143

eval\_samples\_per\_second = 22.637

eval\_steps\_per\_second = 2.849

# Method3.2

\*\*\*\*\* eval metrics \*\*\*\*\*

epoch = 5.0

eval\_accuracy = 0.5032

eval\_loss = 2.5262

eval\_perplexity = 12.5057

eval\_runtime = 0:00:06.32

eval\_samples = 143

eval\_samples\_per\_second = 22.61

eval\_steps\_per\_second = 2.846

# Method4.1

\*\*\*\*\* eval metrics \*\*\*\*\*

epoch = 5.0

eval\_accuracy = 0.4979

eval\_loss = 2.5658

eval\_perplexity = 13.0107

eval\_runtime = 0:00:05.56

eval\_samples = 143

eval\_samples\_per\_second = 25.714

eval\_steps\_per\_second = 3.237

# Method4.2

\*\*\*\*\* eval metrics \*\*\*\*\*

epoch = 5.0

eval\_accuracy = 0.4985

eval\_loss = 2.5606

eval\_perplexity = 12.9437

eval\_runtime = 0:00:05.58

eval\_samples = 143

eval\_samples\_per\_second = 25.621

eval\_steps\_per\_second = 3.225