

LM Evaluation

- ▶ Accuracy doesn't make sense as an evaluation metric — predicting the next word is generally impossible so accuracy values would be very low
- ▶ Instead, evaluate LMs on the **likelihood of held-out data** (averaged to normalize for length)

$$\frac{1}{n} \sum_{i=1}^n \log P(w_i | w_1, \dots, w_{i-1})$$

- ▶ **Perplexity**: $\exp(\text{average negative log likelihood})$. Lower is better.
 - ▶ Suppose we have probs $1/4, 1/3, 1/4, 1/3$ for 4 predictions
 - ▶ Avg NLL (base e) = 1.242 Perplexity = 3.464 \leq geometric mean of denominators
- ▶ Perplexity numbers usually range from 10-200, depending on model quality. They're standard in LM research but not used much elsewhere.