Function List and Descriptions

prepare_and_split_corpus(ds)

- Concatenates 'train', 'validation', and 'test' dataset text into a single corpus, then splits it into training, validation, and test sets by 80%, 10% and 10%.

tokenize(text)

- Performs a basic whitespace tokenization on the input text. Used to prepare text for custom BPE tokenizer training.

compute_coverage(tokenizer, dataset, sample_size=1000)

- Calculates the percentage of tokens in the dataset that are covered by the tokenizer (i.e., not mapped to <UNK>). Useful for evaluating tokenizer quality.

encode_text_str(tokenizer, text)

Encodes raw text into a list of token IDs using the trained BPE tokenizer.

build_input_target_pairs(token_ids, block_size=32)

 Generates (input, target) pairs using a sliding window approach for training next-token prediction models.

Language Modeling Dataset

 A custom PyTorch Dataset class that wraps tokenized input-target sequences for use with DataLoader(shuffle the data in each epoch).

EmbeddingLayer

- Combines token and positional embeddings into dense vectors with dropout. Forms the input layer of the GPT model.

SelfAttention

 Implements multi-head self-attention using dot-product attention mechanism to capture inter-token dependencies.

FeedForward

 A two-layer MLP with ReLU activation and dropout, applied independently to each token position.

TransformerBlock

 A single transformer block composed of LayerNorm, multi-head attention, and feed-forward layers with residual connections.

GPT

 The main transformer-based language model class. Stacks multiple TransformerBlocks with final LayerNorm and linear output head.

compute_loss(model, batch)

- Computes cross-entropy loss between model outputs and target token

sequences.

train_one_epoch(model, dataloader, optimizer, loss_fn, device)

 Trains the model for one epoch by running forward and backward passes, and updating weights.

evaluate_loss(model, val_loader, loss_fn, device)

Evaluates average loss on the validation set.

evaluate_perplexity(model, dataloader)

- Calculates perplexity from average validation loss. Perplexity is an evaluation metric for language models.

compute_grad_norm(model)

- Computes the total gradient norm across model parameters to monitor training stability.

hyperparameter_search(...)

- Performs a grid search over model hyperparameters such as learning rate, number of layers/heads, embedding dimension and returns the best configuration.
 - Use validation data to fine tune
 - Each config runs 10 epochs

retrain_with_best_parameters(...)

- Perform a retrain on the tuned best parameters
- Use validation data to fine tune
- Use on test data to compute perplexity
- Each config runs 20 epochs