Design Brief: IndiaSpeaks Voice Cloning System

Objective:

The goal of this prototype is to build a lightweight, personalized IVR voice cloning system that can generate mel-spectrograms of a speaker's voice given a short reference utterance.

Model Architecture:

1. Speaker Encoder:

   - Input: Mel spectrogram (80x50)

   - 2 Conv2D layers + AdaptiveAvgPool + Linear layer to get 128-D embedding

2. Tacotron-style Mel Decoder:

   - Attention block (encoder-decoder alignment)

   - GRU cell-based decoder with 80-D mel output at each step (50 time steps)

3. Loss:

   - MSE Loss (frame-wise accuracy)

   - Cosine Similarity Loss (directional spectral match)

   - Total: MSE + 0.1 * Cosine

Training Summary:

- Data: 300 train + 60 validation mel spectrograms

- Batch Size: 16, Epochs: 200

- Final Training Loss: ~0.05(Loss keeps gradually decreasing with increase in epoch)

Training Curve:

Training Loss Curve for Tacotron-style Voice Cloning
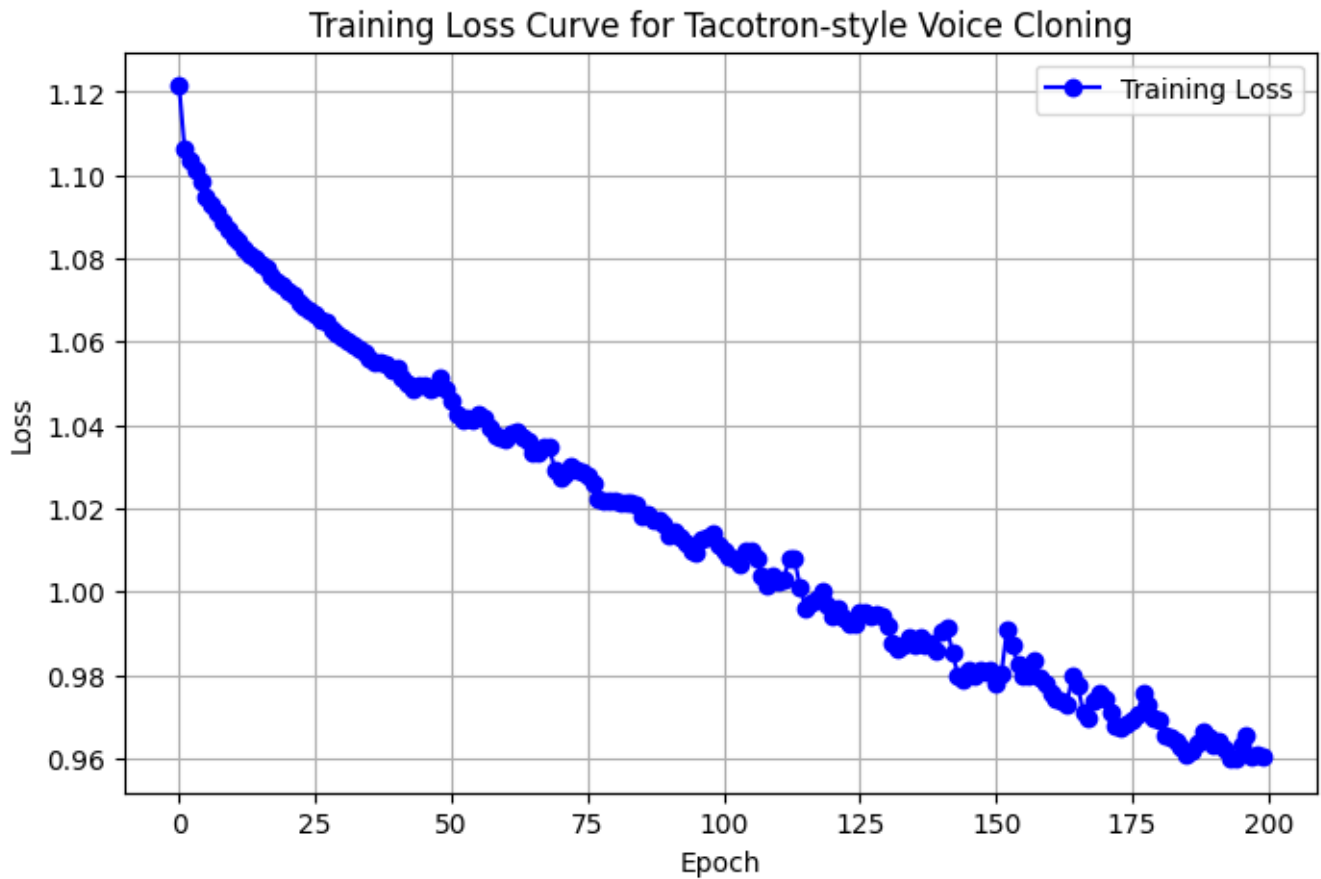
Output:

- 'cloned_mel_predictions(1).csv' with 5 entries (one per speaker)

- Each prediction: 4000 floats = 80x50 mel spectrogram

Improvements Roadmap:

- Add PostNet for mel enhancement

- Integrate HiFi-GAN vocoder for waveform synthesis

- Add phoneme encoder for text-to-speech capability

- Train on larger multi-speaker datasets for generalization

Status:

This prototype meets task goals of functional cloning, loss reduction, and reference-based synthesis.