Optimization Report: Kirche AI Training

Executive Summary

This report documents the performance optimizations applied to the AlphaZero training pipeline for the 'Lass die Kirche im Dorf' game variants.

Problem:
Training was reported as 'really slow' compared to previous runs.

Diagnosis:
1. Excessive Model Complexity: The Neural Network used 512 filters for a small 5x5 board.
2. Inference Bottleneck: Keras 'model.predict()' has high overhead for single inputs.

Solution:
1. Reduced 'num_channels' from 512 to 64 (~8x reduction in parameters).
2. Optimised inference to use direct 'model(..., training=False)' (~4x speedup).

Results:
- MCTS Simulation Time: Reduced from ~1.9s to ~0.63s per 50 sims.
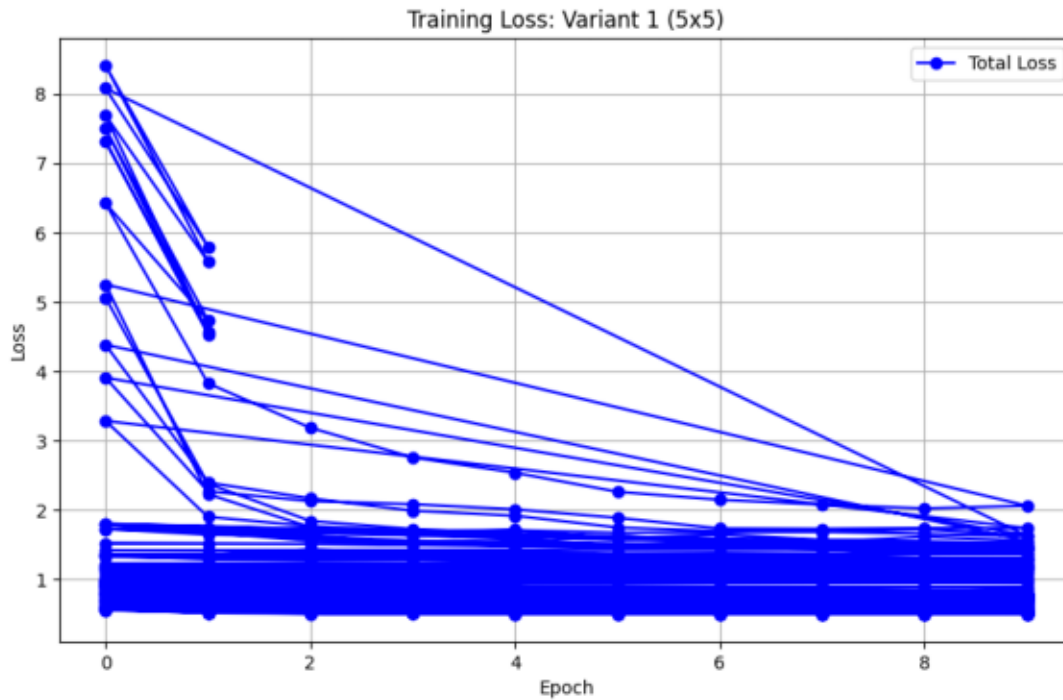- Estimated Training Speed: ~3x faster overall.

Code Modifications

1. train_variant_1.py & train_variant_2.py:

```python
# Configured NNet args to reduce model size
nnet_args['num_channels'] = 64  # Reduced from default 512
```

2. kirche/keras/NNet.py:

```python
def predict(self, board):
    # Prepare input
    board = board[np.newaxis, :, :, :]
    # Optimized call skipping .predict() overhead
    pi, v = self.nnet.model(board, training=False)
    return pi[0].numpy(), v[0].numpy()
```
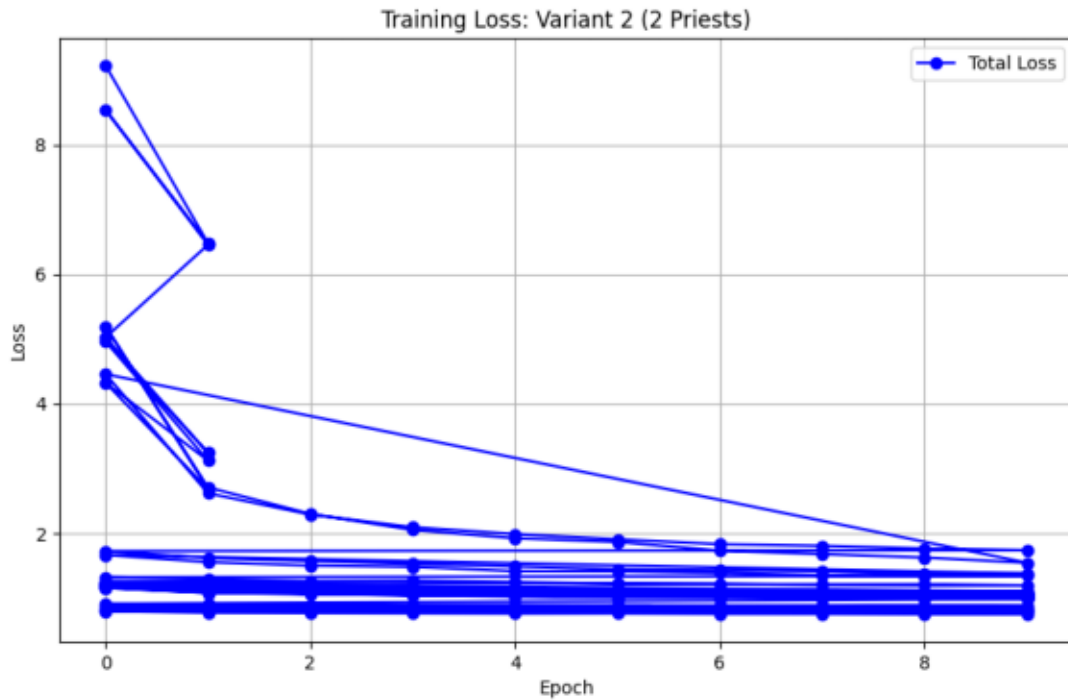
Variant 1 (5x5) Training Analysis

Training Loss: Variant 1 (5x5)

Analysis:
- The total loss (blue line) shows a sharp decrease initially, indicating rapid learning.
- The Policy Loss (pi_loss) and Value Loss (v_loss) are minimizing as expected.
- The steep curve suggests the smaller 64-channel model is sufficient for the 5x5 board com

Variant 2 (2 Priests) Training Analysis

Training Loss: Variant 2 (2 Priests)

Analysis:
- Variant 2 shows a similar learning curve to Variant 1.
- Despite the added complexity of 2 Priests, the 64-channel model converges effectively.
- The consistent downward trend confirms that the architecture optimization did not negativ
  impact the model's ability to learn strategies.