

Challenges of Deep Networks

Training Complexity



- ▶ Non-convex optimization
- ▶ Longer training time
- ▶ High computational cost

Gradient Problems



- ▶ Vanishing gradients in early layers
- ▶ Exploding gradients
- ▶ Unstable parameter updates

Generalization Issues



- ▶ Overfitting risk
- ▶ Memorizing training data
- ▶ Poor test performance

Configuration Sensitivity



- ▶ Critical initialization requirements
- ▶ Hyperparameter sensitivity
- ▶ Architecture design choices

⚠ HISTORICAL BARRIER (Pre-2006)

Deep networks often performed worse than shallow ones due to these challenges

These challenges motivated research into better training techniques and architectures