





ADVANCE ALL MARCH EVERLASTING

**DEFENSE: ADVERSARIAL TRAINING**

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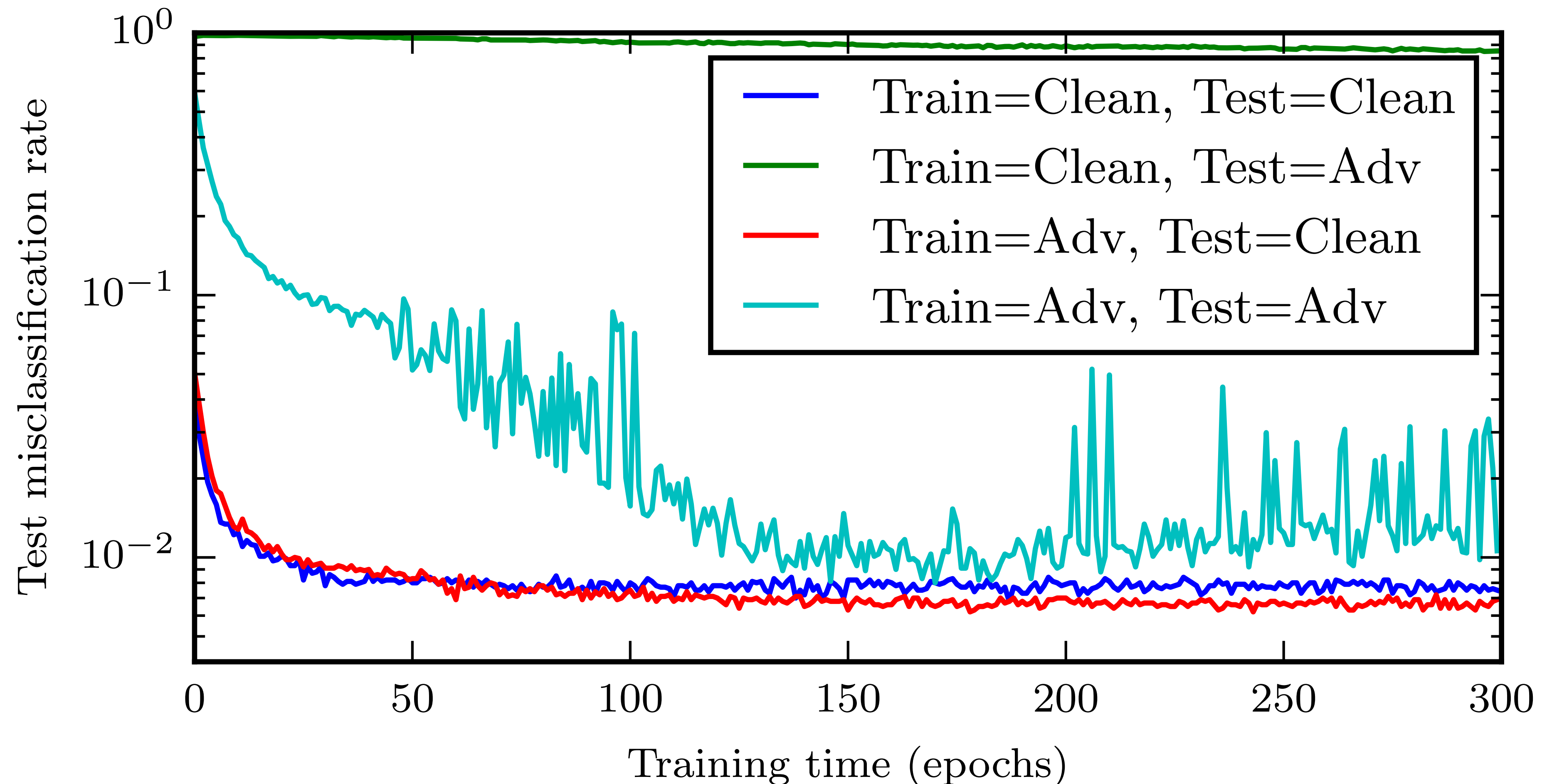
- ▶ Madry et al. proposed Adversarial Training as saddle point optimisation problem.
- ▶ They proved using Danskin's Theorem that Adversarial Training is solving this saddle point problem.

$$\min_{\theta} \rho(\theta) \text{ where } \rho(\theta) = \mathbb{E}_{(x,y) \sim \mathcal{D}} \left[ \max_{\delta \in \mathcal{S}} L(\theta, x + \delta, y) \right]$$

Madry, A, Makelov, A, Schmidt, L, Tsipras, D., & Vladu, A. (2017). Towards deep learning models resistant to adversarial attacks



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