

## Control strategies for the McKean-Vlasov equation

How can we control long-term behaviour of many interacting agent systems?

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### Interacting agents

How do pairwise interactions create complex behaviour?

**Opinion dynamics:** simple models of how individual beliefs evolve under peer influence, external forces, and randomness.

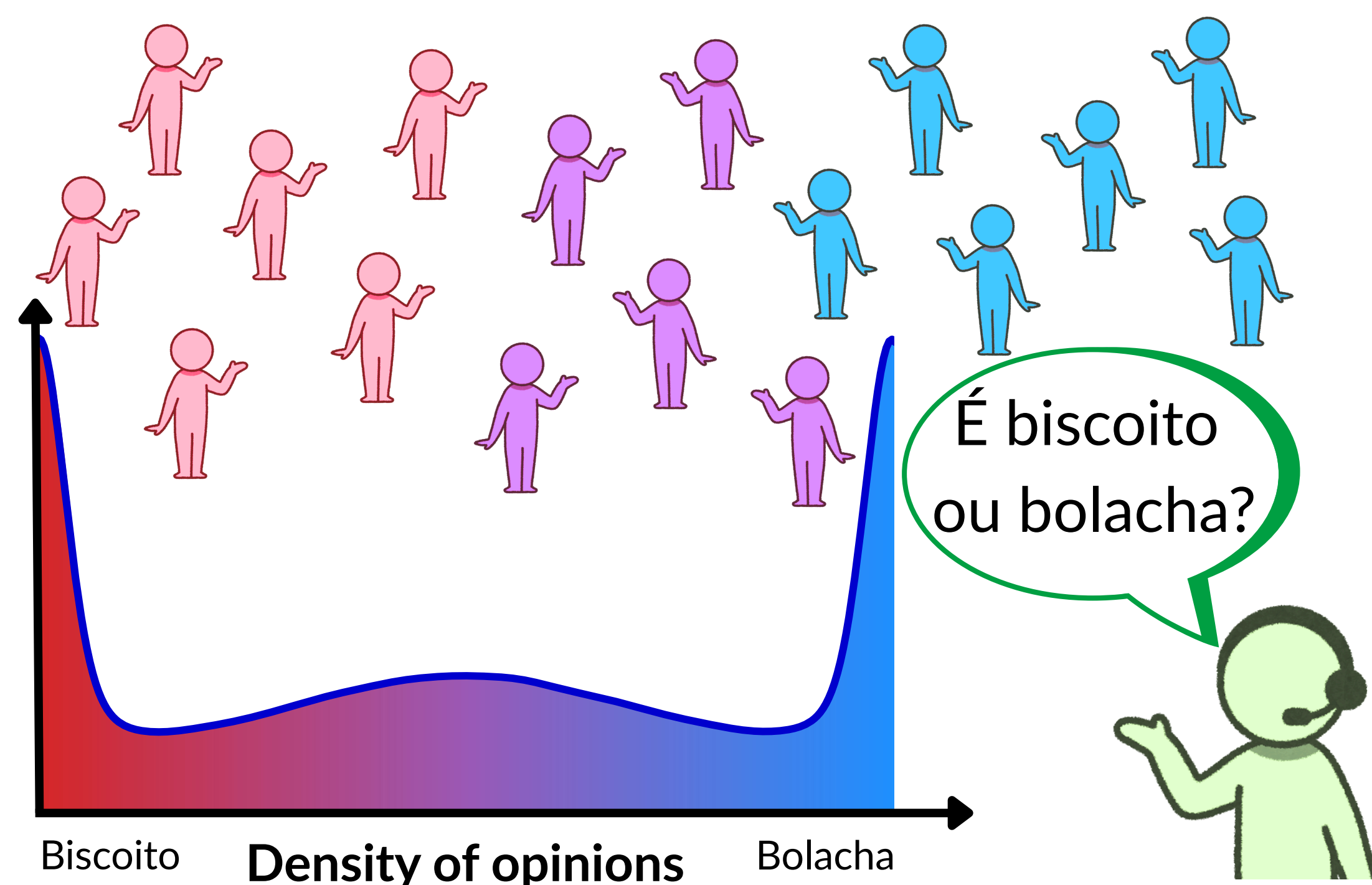


Figure 1: "Biscoito or bolacha?": a toy model of opinion dynamics, where people split into camps and the density shows their collective state.

✓ **Individual model:** Agents follow trajectories on domain  $\Omega$ , influenced by a potential  $V$ , their **peers** via  $W$ , and noise with strength  $\sigma > 0$ :

$$dX_t^i = -\left(\nabla V(X_t^i) + \frac{1}{N} \sum_{j=1}^N \nabla W(X_t^i - X_t^j)\right) dt + \sqrt{2\sigma} dB_t^i,$$

✓ **Large population:** When  $N \rightarrow \infty$ , the system can be described by a single **density**  $\mu$ , satisfying the **McKean-Vlasov** (MV) equation:

$$\partial_t \mu = \sigma \Delta \mu + \nabla \cdot (\mu (\nabla V + \nabla W * \mu)), \quad (W * \mu)(x) = \int_{\Omega} W(x - x') \mu(x') dx',$$

✓ **Collective effects:** Interactions can cause the system to converge **very slowly** or to settle into **several different possible equilibria**.

### Stabilisation: Selecting Equilibria

✓ **Multiple equilibria:** we can **choose** which outcome dominates.

✓ **Stabilisation:** modify the dynamics so the **desired equilibrium** becomes attractive.

✓ **Toy example:** two equilibria,  $(1, 1)$  stable,  $(0, 0)$  unstable. A simple **feedback control** can stabilise  $(0, 0)$  instead.

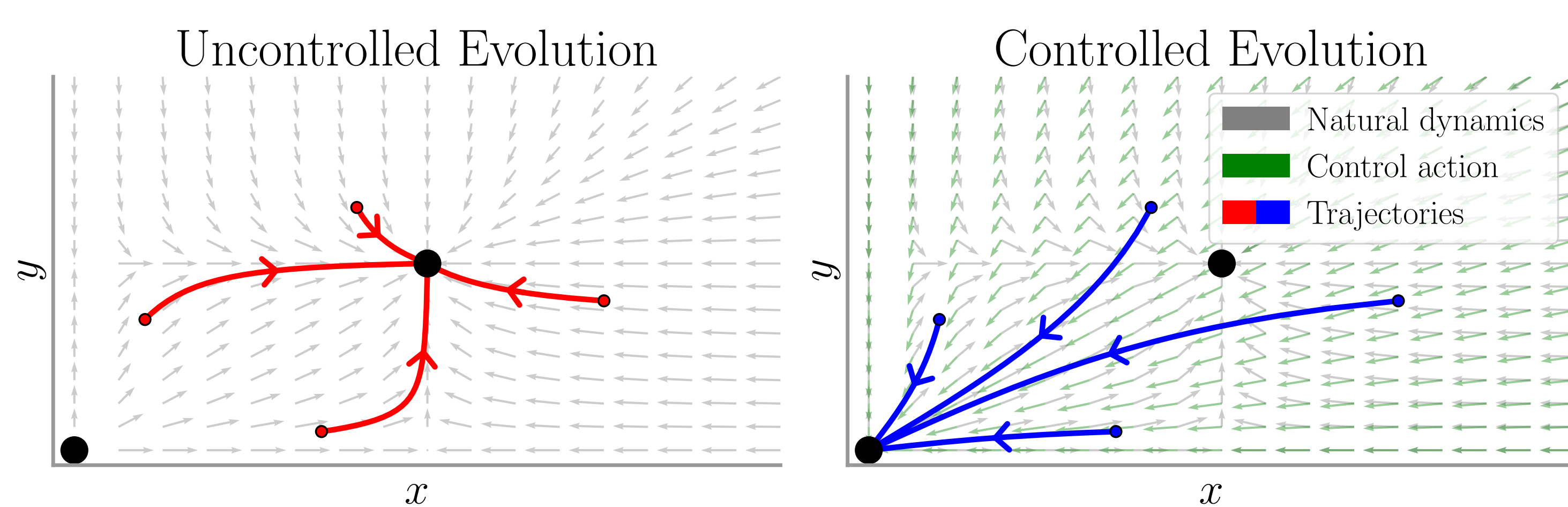


Figure 2: Control changes stability: without control, trajectories converge to  $(1, 1)$ ; with control, they converge to  $(0, 0)$ .

**Model:**  $\dot{z} = f(z) + Bu$  with equilibrium  $\bar{z}$ .

**Goal:** find a feedback control  $u = -g(z)$  that yields  $(C > 0, \delta > 0)$

$$\|z(t) - \bar{z}\| \leq C e^{-\delta t} \|z(0) - \bar{z}\|.$$

**Method:** linearise  $f$  at  $\bar{z}$  and analyse  $A := Df(\bar{z})$ . Then apply controls such as  $u(t) = -K(z(t) - \bar{z})$  for a suitable  $K$ .

**Extension to densities:** replace  $z$  by the  $\mu$ , linearise the MV equation, and use a suitable linear feedback.

### Control Framework

How can we steer (or accelerate) the dynamics to  $\bar{\mu}$ ?

We modify the potential  $V$  with **shape functions**  $\{\alpha_j(x)\}_{j=1}^m$  and time controls  $u_j(t)$ :

$$V(x) + \sum_{j=1}^m u_j(t) \alpha_j(x).$$

**Goal:** exponential convergence  $\|\mu(t) - \bar{\mu}\|_{L^2(\Omega)} \lesssim e^{-\delta t}$  for a given  $\delta > 0$ .

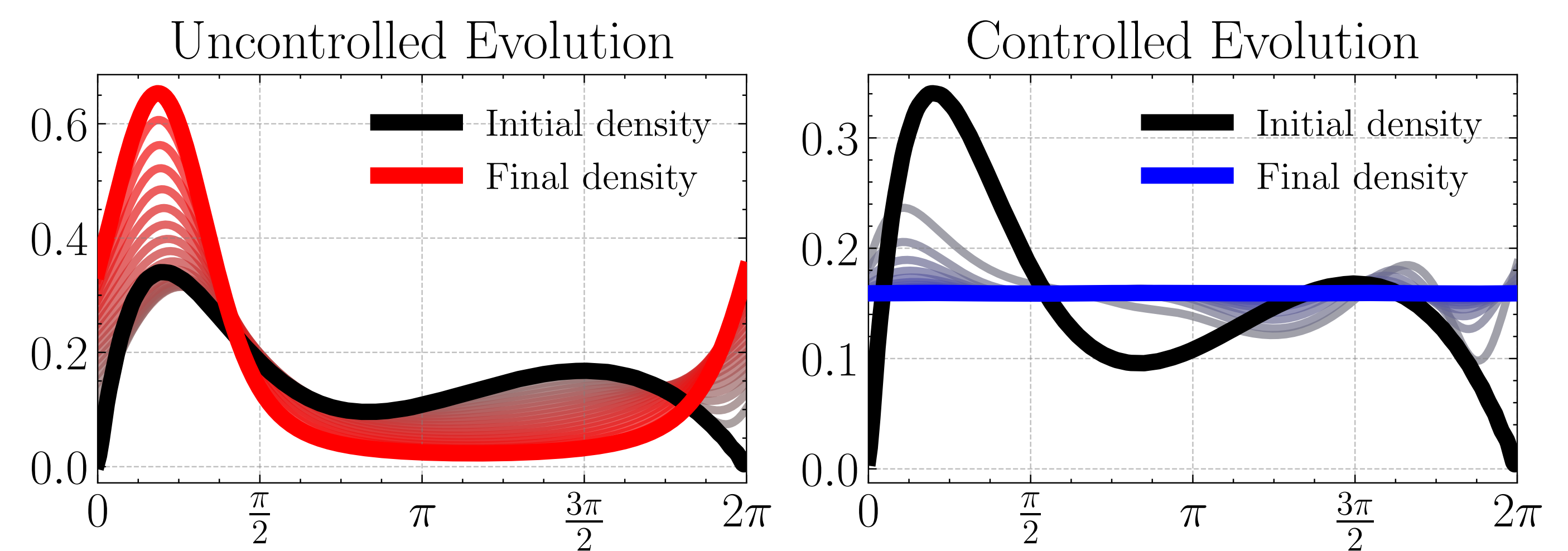


Figure 3: Kuramoto model ( $W(x) = -5 \cos(x)$ ,  $V(x) = 0$ ,  $\Omega = [0, 2\pi]$ ). Initial state (black) converges to red (uncontrolled) or blue (controlled) equilibria.

**Method:** linearise the MV equation at  $\bar{\mu}$ , set  $u(t) = -\mathcal{K}(\mu(t) - \bar{\mu})$ , and choose  $\mathcal{K}$  solving an **algebraic Riccati equation** so that all eigenvalues satisfy  $\Re \lambda \leq -\delta$ , i.e., exponential decay at rate  $\delta$ .

**Nonlinear extension proof:** this control stabilises the MV dynamics by bounding the **nonlinear terms** and applying a **fixed-point** argument.

### Cosine-coupled rotator model: numerics

The feedback control drives the system to the desired equilibrium **exponentially**, in contrast to the slower uncontrolled dynamic.

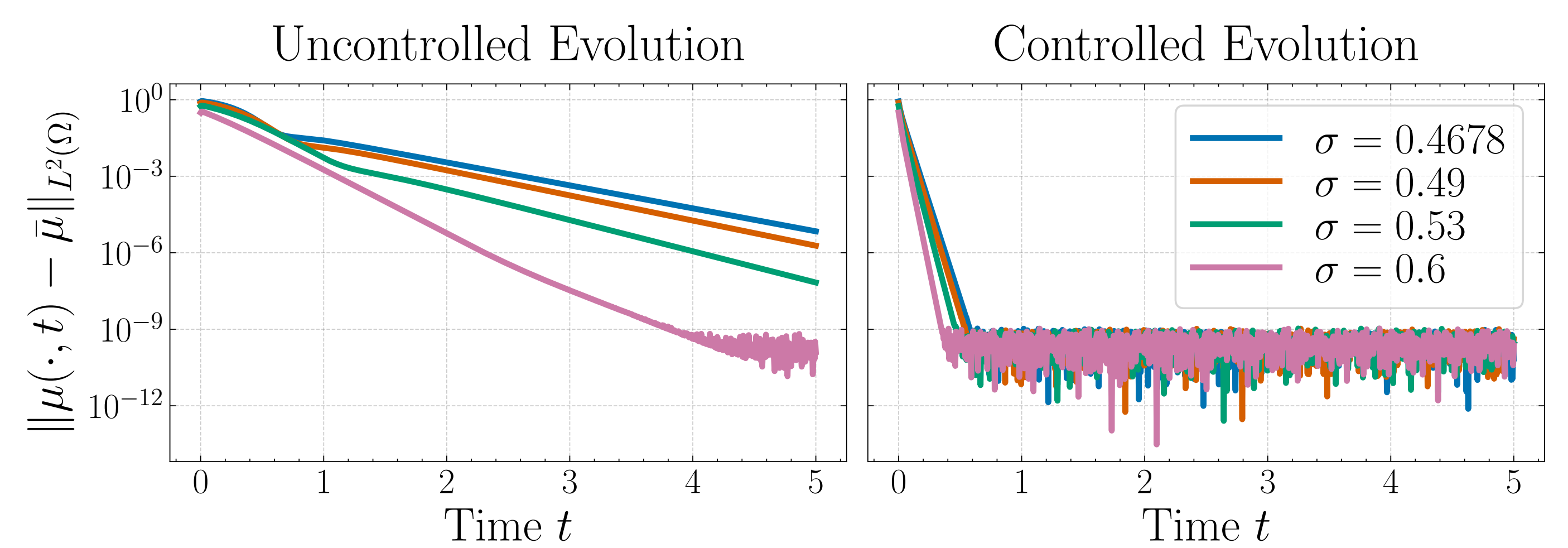


Figure 4: O(2) Kuramoto model with  $V(x) = -\eta \cos(2\pi x)$ ,  $W(x) = -\cos(2\pi x)$ . The norm is taken in the weighted space  $L^2(\Omega, \bar{\mu}^{-1}) = \{f : f \bar{\mu}^{-1/2} \in L^2(\Omega)\}$ .

For small noise levels ( $\sigma$ ), the uncontrolled system converges very slowly, while our feedback control enforces exponential decay at  $\delta = 1$ .

### Conclusions and Take-Home

- ✓ **Interactions create structure:** slow mixing/convergence and metastability.
- ✓ **Stabilisation:** exponential convergence to the chosen equilibrium.
- ✓ Numerical method: spectral methods + Riccati feedback.
- ✓ **Next:** higher-dimensional solvers and robustness to perturbations.

### Acknowledgements



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