

Compactness and large deviations

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A weak LDP for occupation measures

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- Equivalently: then, **exponential decay of probabilities**:

$$\mathbb{P}(L_t \simeq f^2 dx \text{ on } B) \sim \exp \left\{ -t I(f^2) \right\} \quad \|f\|_2 = 1, f \in H_0^1(B)$$

$I(f^2) = \frac{1}{2} \|\nabla f\|_2^2$ Donsker-Varadhan rate function.

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- Here is a problem where it does not work.

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- Even more: Can we say something about the **measures**

$$d\mathbb{Q}_t = \frac{1}{Z_t} \exp \left\{ \dots \right\} d\mathbb{P}?$$

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$\rightarrow p_1 \in [0, 1] \quad R \uparrow \infty$

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- Continue recursively: $\{\mu_n\}_n$ **concentrates on compact pieces of mass $\{p_j\}_j$** , which are **widely separated**, while the rest of the mass $1 - \sum_j p_j$ dissipates. μ_n **on these compact pieces, when suitably shifted, converges along subsequences.**

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- Given any sequence $(\mu_n)_n$ in $\mathcal{M}_1(\mathbb{R}^d)$, pass to its equivalence class $\widetilde{\mu}_n$ in $\widetilde{\mathcal{M}}_1$. There is a subsequence which converges to some element in \mathbf{M}^* .

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- **Conclude:** \mathbf{M}^* is the compactification of $\widetilde{\mathcal{M}}_1$.

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optimal strategy: move "independently" on distant regions

$$\leq \exp \left\{ - \sum_j p_j \underbrace{I(\alpha_j)} \right\}$$

where $I(\alpha)$ is the Donsker-Varadhan rate function.

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Our model is shift-invariant: Does not care about equivalence classes!

Theorem (M-Varadhan 2014)

The family of distributions \tilde{L}_t satisfies a (strong) LDP in the compact space \mathbf{M}^* with rate function

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- We have a model on a non-compact space. If model is shift-invariant, we can address questions for exponential growth of integrals/ exponential decay of probabilities!

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- Culmination: Mean-field approximation of the Polaron:

Theorem (Bolthausen-König-M 2015)

$$Q_t \circ L_t^{-1} \Rightarrow \frac{\int_{\mathbb{R}^3} dx \psi_0(x) \delta_{\theta_x \psi_0^2}}{\int_{\mathbb{R}^3} dx \psi_0(x)}$$