

# The microcanonical barrier and the ensemble tailoring framework

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- 3 Ensemble tailoring
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# Examples for first order phase transition



**Magnetization**

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**Magnetization**



**Condensation/Evaporation**

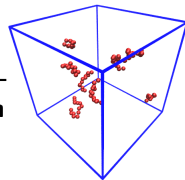
# Examples for first order phase transition



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←  
**Aggregation**

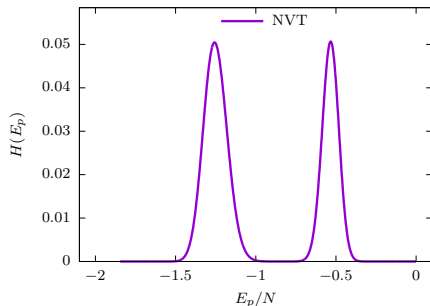


**Condensation/Evaporation**

# Phase coexistence

## Sampling problem:

- Phase coexistence
- Exponential critical slowing down

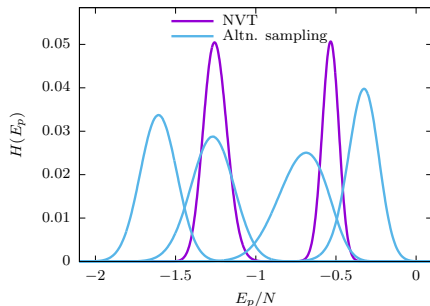


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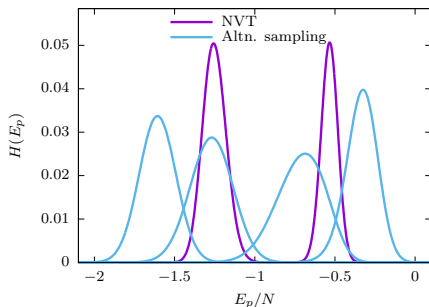
# Phase coexistence

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## Recover NVT behavior with reweighting:

$$\langle O \rangle_{\text{NVT}} = \frac{\left\langle O \frac{\exp(-\beta E_p)}{W(E_p)_{\text{samp}}} \right\rangle_{\text{samp}}}{\left\langle \frac{\exp(-\beta E_p)}{W(E_p)_{\text{samp}}} \right\rangle_{\text{samp}}}$$

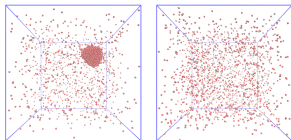


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# Barrier definition

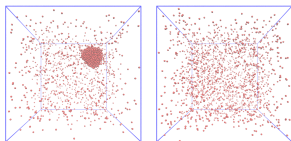
Example: Droplet condensation of the  $N = 2048$  particle Lennard-Jones system.



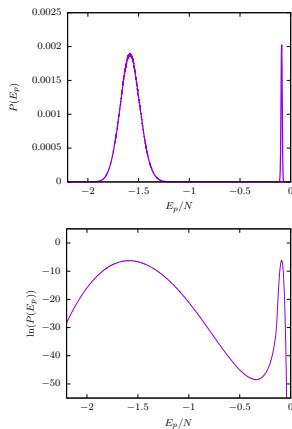
**Figure** : Example configurations for the droplet (left) and gaseous phase (right).

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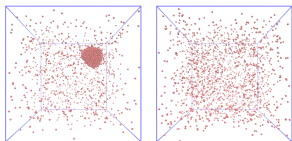
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**Figure :** Canonical equal-height histogram in non-logarithmic and logarithmic display for the  $N = 2048$  Lennard-Jones particle system.

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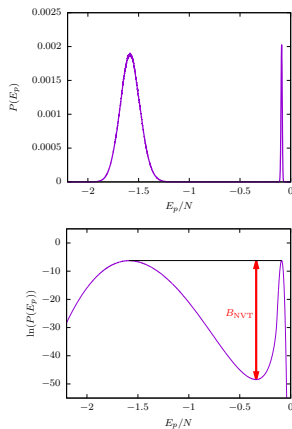


**Figure :** Example configurations for the droplet (left) and gaseous phase (right).

## What is the barrier?

$$B = \ln \left[ \frac{P^{\text{eqh}}(E_p^{\text{max}})}{P^{\text{eqh}}(E_p^{\text{min}})} \right]$$

- Indicates how unlikely it is to observe the transition between the coexisting phases



**Figure :** Canonical equal-height histogram in non-logarithmic and logarithmic display for the  $N = 2048$  Lennard-Jones particle system.

# Correspondences in the NVT and NVE ensemble

## Canonical ensemble

Full phase space  
partition function

$$\tilde{Z}(\beta) = \int_{\mathbf{x}} \int_{\mathbf{p}} dRdP e^{-\beta E},$$

## Microcanonical ensemble

$$\tilde{\Gamma}(E) = \int_{\mathbf{x}} \int_{\mathbf{p}} dRdP \delta(E - (E_k + E_p))$$

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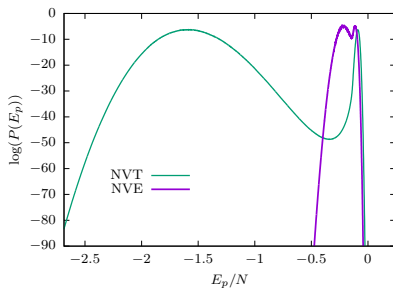
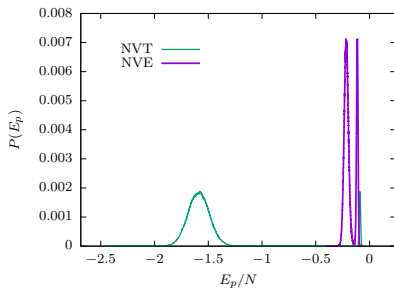
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The expressions for the configuration weights allow for an easy adaptation of canonical simulation methods and simplify analytical considerations.

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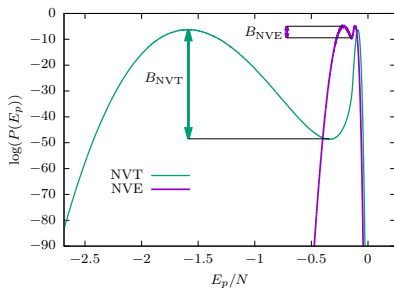
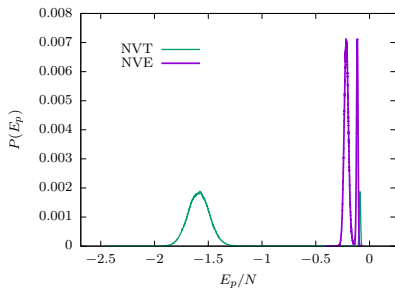
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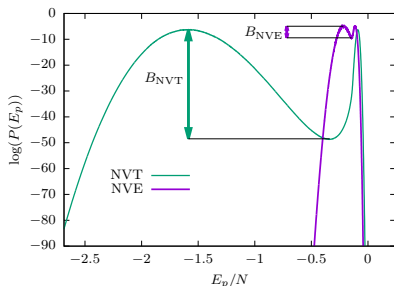
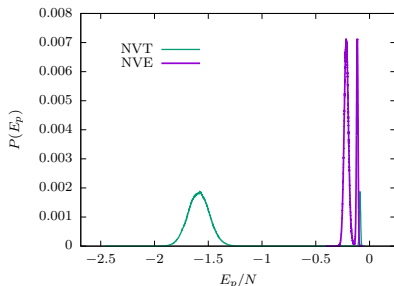
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The energy-driven phase transition in the NVE ensemble shows a much smaller barrier than the equivalent temperature-driven transition in the NVT ensemble.

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$$K(E_p) = \frac{\partial \ln \Omega(E_p)}{\partial E_p}$$

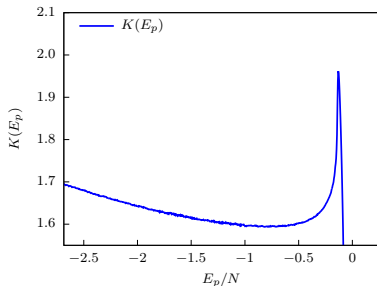


Figure :  $K(E_p)$  from the  $N = 2048$  Lennard-Jones system and  $D(E_p)$  at the equal-area point.

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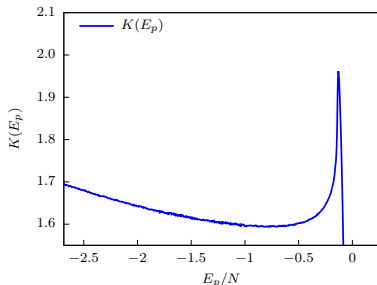


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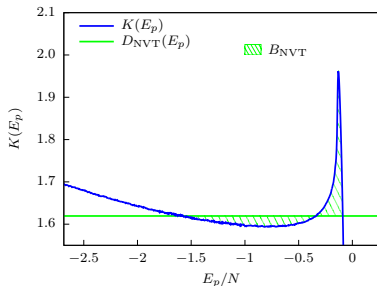


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For the NVT ensemble we obtain:

$$D_{\text{NVT}}(E_p) = -\frac{\partial}{\partial E_p} \ln(e^{-\beta E_p}) = \beta$$

and choose  $\beta = \beta_{\text{eqh}}$ .

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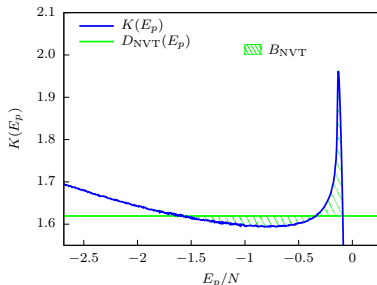


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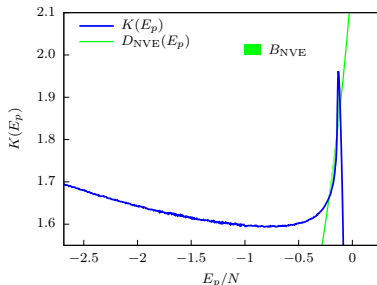


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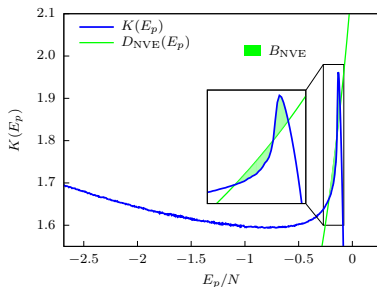


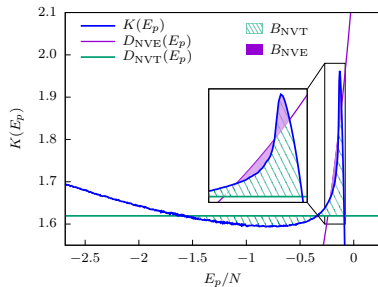
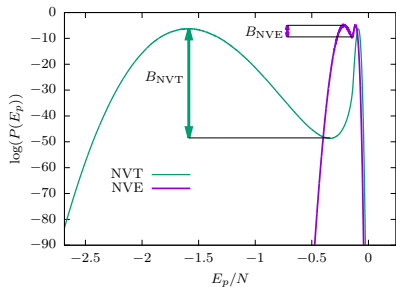
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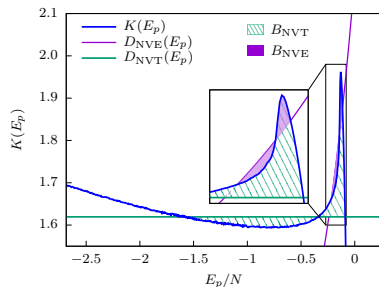
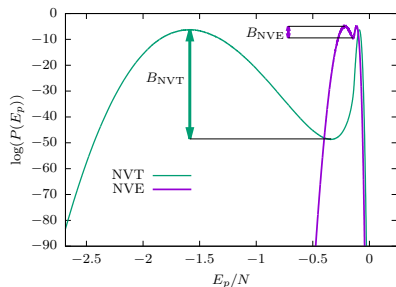
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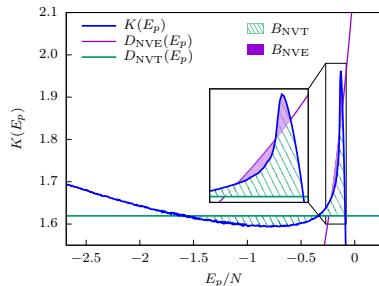
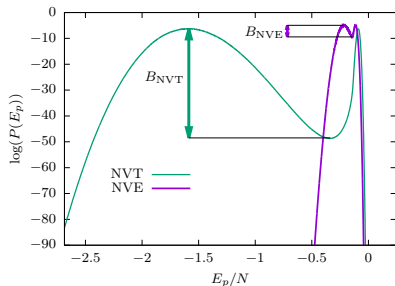


- $K(E_p)$  has always an S-shape [1] if a system shows canonical phase coexistence at the phase transition (first-order transitions).

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# In general:



- $K(E_p)$  has always an S-shape [1] if a system shows canonical phase coexistence at the phase transition (first-order transitions).
- For such general first-order transitions it can be shown that the NVE barrier always has to be smaller or may even vanish [2].

$$B_{NVE} < B_{NVT}$$

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# Applications:

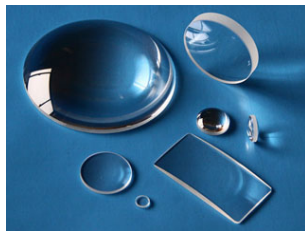
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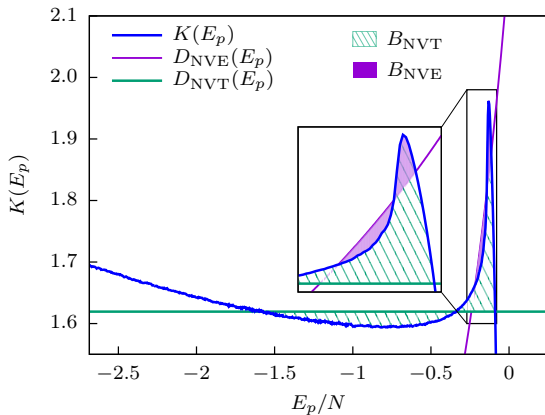
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- The smaller microcanonical barrier should be observed in experiments as well.
- Possible applications for industrial processes where phase transitions are crucial (steel production, glass production, ...)?



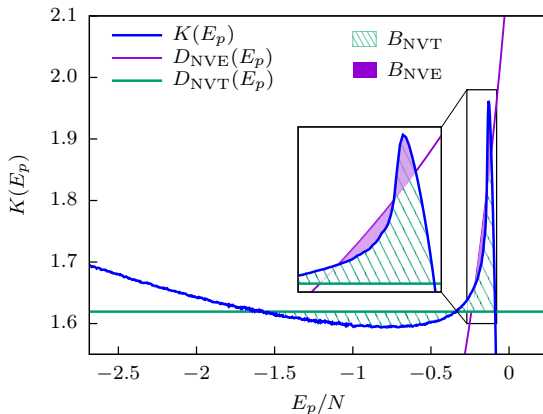
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How to tailor an ensemble with a specific or even vanishing barrier?

# Ensemble Tailoring:

## Multicanonical method (MUCA) [1,2]:

$$W_{\text{MUCA}}(E_p) = \frac{1}{\Omega(E_p)}$$

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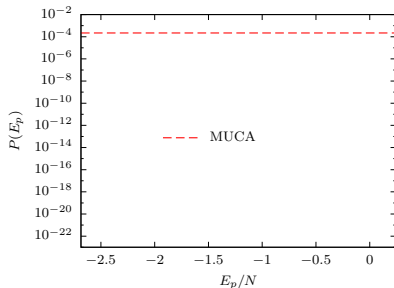
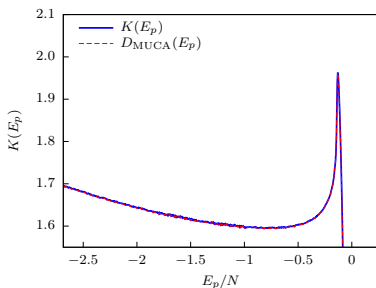
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No enclosed area and hence no transition barrier.



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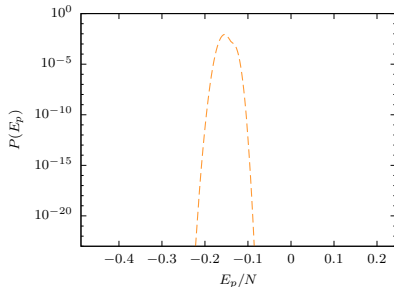
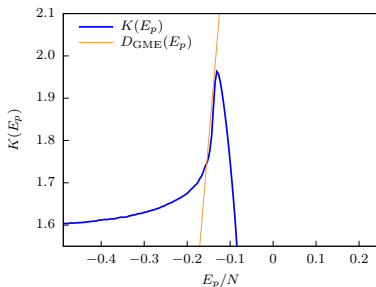
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Barrier vanishes with a large enough slope parameter A.



# Ensemble Tailoring:

## Artificial polynomial ensemble:

$$D(E_p) = A(E_p - E_p^0)^{13} + B(E_p - E_p^0) + C,$$

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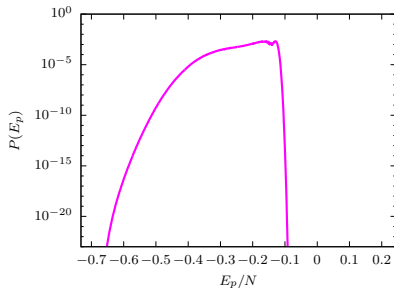
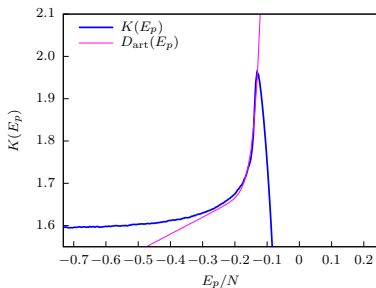
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Artificial ensemble with a large histogram width and a small barrier.





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- A lower barrier leads to fast simulations for phase transitions.
- The proposed analytical framework may be used to tailor artificial ensembles for computational purposes by an educated guess of  $D(E_p)$ .