

0.1 Calculating canonical ensemble averages

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1 import numpy as np

2 class Ensemble:
3     def __init__(self, Es, lngs, name = 'Canonical ensemble',  $\lambda$  = None):
4         self.Es = Es
5         self.lngs = lngs
6         self.name = name
7         # Choose to scale the exponent of Z to be a convenient size.
8         # This can be improved if needed by taking into account typical  $\beta Es$ .
9         self. $\lambda$  = max(lngs) if  $\lambda$  is None else  $\lambda$ 
10    def Z $\lambda$ (self,  $\beta$ ):
11        return np.sum(np.exp(-(np.outer( $\beta$ , self.Es) - self.lngs + self. $\lambda$ )), 1)
12    def Z(self,  $\beta$ ):
13        return np.exp(self. $\lambda$ ) * self.Z $\lambda$ ( $\beta$ )
14    def p(self,  $\beta$ ):
15        return np.exp(-( $\beta$  * self.Es - self.lngs + self. $\lambda$ )) / self.Z $\lambda$ ( $\beta$ )
16    def average(self, f,  $\beta$ ):
17        return np.sum(f(self) * np.exp(-(np.outer( $\beta$ , self.Es) - self.lngs + self. $\lambda$ )), 1) / self.Z $\lambda$ ( $\beta$ )
18    def energy(self,  $\beta$ ):
19        return self.average(lambda ens: ens.Es,  $\beta$ )
20    def energy2(self,  $\beta$ ):
21        return self.average(lambda ens: ens.Es**2,  $\beta$ )
22    def heat_capacity(self,  $\beta$ ):
23        return self.energy2( $\beta$ ) - self.energy( $\beta$ )**2
24    def free_energy(self,  $\beta$ ):
25        return -np.log(self.Z( $\beta$ )) /  $\beta$ 
26    def entropy(self,  $\beta$ ):
27        return  $\beta$  * self.energy( $\beta$ ) + np.log(self.Z( $\beta$ ))
```