# **ZJU Computational Physics: Homework #5**Due on Monday, December 23, 2024

Github: https://github.com/NAKONAKO4/ZJU-computational-physics-NAKO

**NAKO** 

### **Problem 1**

#### **MD: Approach to Equilibrium**

a. 可以看到能量和动量都是守恒的,且动量基本为  $0(10^{-14}$  数量级);同时计算得到的压强与理想气体压强差值相对误差较小。)

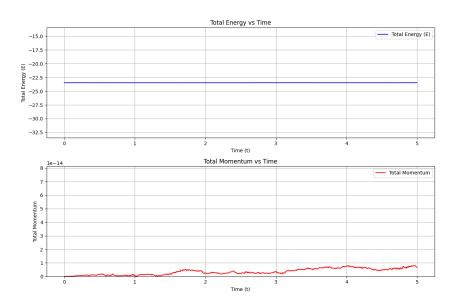


图 1: 能量和动量随时间变化

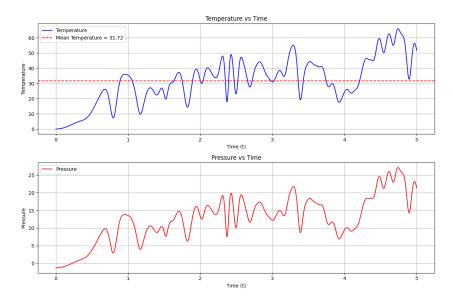


图 2: 温度和压强随时间变化

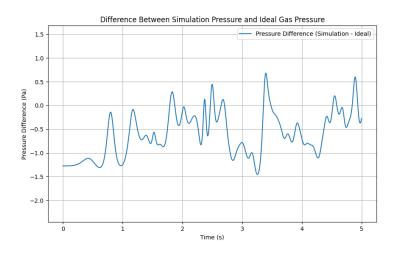


图 3: 压强计算值与理想气体公式计算得到压强差值

# b. 可以看到能量和动量都是守恒的,且动量基本为 $0(10^{-14}$ 数量级))

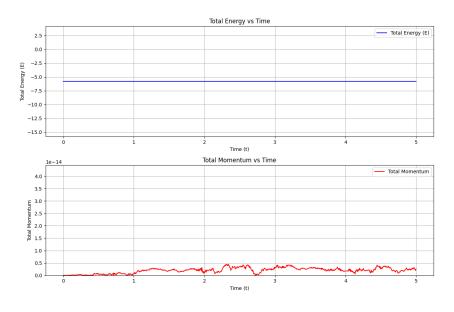


图 4: 能量和动量随时间变化

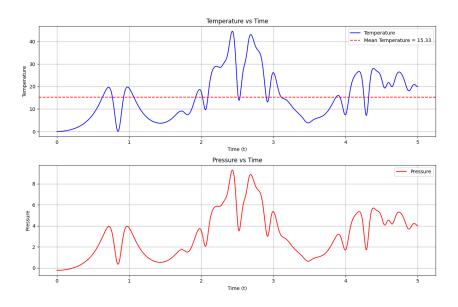
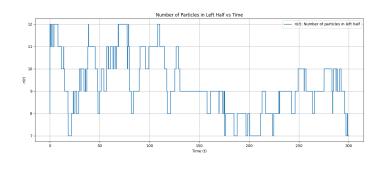
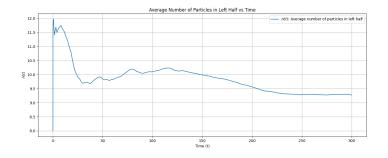


图 5: 温度和压强随时间变化

### c. 可以看到接近平衡态时,左边粒子数均值会趋近于总粒子数的一半 N/2=9)





d. 可以看到能量和动量都是守恒的,且动量基本为  $0(10^{-14}$  数量级);同时计算得到的压强与理想气体压强差值相对误差较小。)

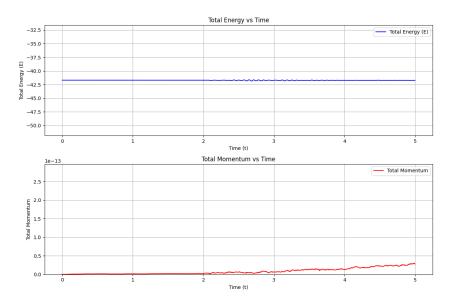


图 6: 能量和动量随时间变化

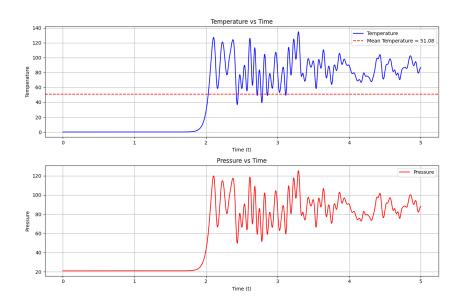


图 7: 温度和压强随时间变化

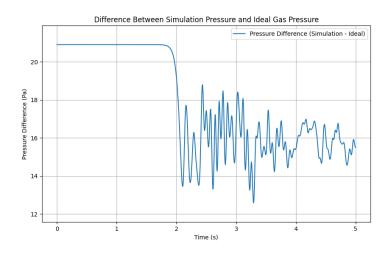


图 8: 压强计算值与理想气体公式计算得到压强差值

e. 可以看到能量和动量都是守恒的,且动量基本为 0  $(10^{-14}$  数量级);同时计算得到的压强与理想气体压强差值相对误差较小。)

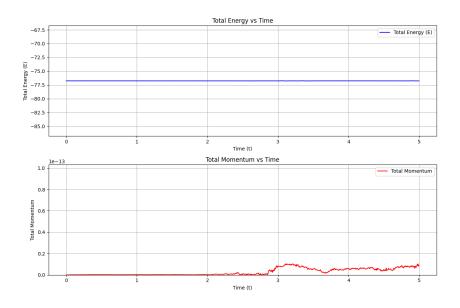


图 9: 能量和动量随时间变化

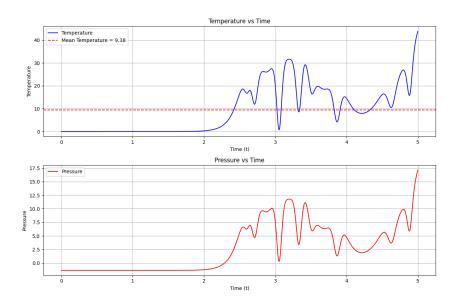


图 10: 温度和压强随时间变化

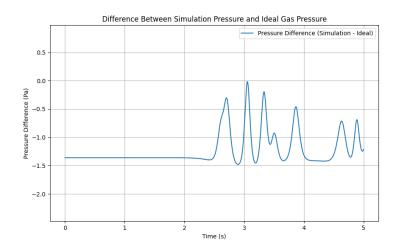


图 11: 压强计算值与理想气体公式计算得到压强差值

abde 题代码如下,对于不同的初始条件只需要更改代码中的初始条件设置即可。c 题代码 见本代码的后一部分

```
import numpy as np
import matplotlib.pyplot as plt

sigma = 0.1
pepsilon = 1
mass = 6.69e-26
tau = sigma * np.sqrt(mass / epsilon)
k_B = 1.38e-23
```

```
10 dt = 0.005
11 dt2 = dt**2
12 N = 18
13 Lx, Ly = 6.0, 6.0
14 k_B = 1.38e-23
15 temperature = 100
16 m = 1
17 area = Lx * Ly
19 def create_lattice(N, Lx, Ly):
      positions = np.zeros((N, 2))
20
      num_rows = int(np.sqrt(N))
21
      num_cols = int(np.ceil(N / num_rows))
22
      x_spacing = Lx / num_cols
23
      y_spacing = Ly / num_rows
24
25
      index = 0
26
      for row in range(num_rows):
27
          for col in range(num_cols):
28
             if index >= N:
29
                 break
             x_pos = (col + 0.5) * x_spacing
31
             y_pos = (row + 0.5) * y_spacing
             positions[index] = [x_pos, y_pos]
33
             index += 1
34
      return positions
35
36
37 def init_velocity(N, temperature, mass):
      stddev = np.sqrt(k_B * temperature / mass)
38
      velocities = np.random.normal(0, stddev, (N, 2))
39
      velocities -= np.mean(velocities, axis=0)
40
      return velocities
41
43 positions = create_lattice(N, Lx, Ly)
44 velocities = init_velocity(N, temperature, m)
46 x, y = positions[:, 0], positions[:, 1]
47 vx, vy = velocities[:, 0], velocities[:, 1]
48 print(vx)
49 ax = np.zeros(N)
50 ay = np.zeros(N)
52 plt.figure(figsize=(6, 6))
53 plt.scatter(x, y, c='blue', label='Particles', s=100)
54 plt.xlim(0, Lx)
55 plt.ylim(0, Ly)
```

```
56 plt.gca().set_aspect('equal', adjustable='box')
57 plt.xlabel('X<sub>□</sub>Position<sub>□</sub>(Å)')
58 plt.ylabel('Y⊔Position⊔(Å)')
59 plt.title('Particle∟Positions⊔in⊔6x6∟Box')
60 plt.grid(color='gray', linestyle='--', linewidth=0.5)
61 plt.legend()
62 plt.show()
65 def check_momentum(vx, vy):
      vx -= np.sum(vx) / N
      vy -= np.sum(vy) / N
67
      return vx, vy
68
69
70 def pbc(pos, L):
      return (pos + L) % L
71
72
73 def separation(ds, L):
      return ds - L * np.round(ds / L)
75
76 def force(dx, dy):
      r2 = dx**2 + dy**2
      if r2 == 0:
          return 0, 0, 0
     rm2 = 1.0 / r2
80
      rm6 = rm2**3
81
      f_{over_r} = 24 * rm6 * (2 * rm6 - 1) * rm2
82
      fx = f_over_r * dx
83
      fy = f_over_r * dy
84
      pot = 4.0 * (rm6**2 - rm6)
85
      return fx, fy, pot
86
88 def accel(x, y, ax, ay):
      ax.fill(0)
89
      ay.fill(0)
      pe = 0.0
      virial = 0.0
      for i in range(N - 1):
93
          for j in range(i + 1, N):
94
              dx = separation(x[i] - x[j], Lx)
95
              dy = separation(y[i] - y[j], Ly)
96
              fx, fy, pot = force(dx, dy)
97
              ax[i] += fx
98
              ay[i] += fy
99
              ax[j] -= fx
100
              ay[j] -= fy
101
              pe += pot
102
```

```
103
              virial += dx* fx + dy* fy
       return pe, virial
104
105
106 def verlet(x, y, vx, vy, ax, ay):
       x += vx * dt + 0.5 * ax * dt2
107
       y += vy * dt + 0.5 * ay * dt2
109
       x = pbc(x, Lx)
       y = pbc(y, Ly)
110
       vx += 0.5 * ax * dt
       vy += 0.5 * ay * dt
113
       pe, virial = accel(x, y, ax, ay)
       vx += 0.5 * ax * dt
114
       vy += 0.5 * ay * dt
115
       ke = 0.5 * m * np.sum(vx**2 + vy**2)
116
       return ke, pe, virial
117
118
119 def compute_momentum(vx, vy):
      px = np.sum(m * vx)
120
       py = np.sum(m * vy)
121
       total_momentum = np.sqrt(px**2 + py**2)
122
       return total_momentum
125 vx, vy = check_momentum(vx, vy)
126 ke = 0.5 * np.sum(vx**2 + vy**2)
127 pe, virial = accel(x, y, ax, ay)
128 total_momentum = compute_momentum(vx, vy)
129 print(f"{'time':>6}_{'E':>12}_{'Momentum':>12}_{'T':>12}_{(P':>12}")
130
131 t_values = []
132 T_values = []
133 E_values = []
134 P_values = []
135 momentum_values = []
136 pressure_diff_values = []
138 t = 0.0
139 while t < 5.0:
       d=2
140
       ke, pe, virial = verlet(x, y, vx, vy, ax, ay)
141
       total_energy = ke + pe
142
       total_momentum = compute_momentum(vx, vy)
143
       pressure = (0.5 * virial) / area
144
145
       T = (2 * ke*epsilon) / ((d * N-d) * k_B)
146
       pressure = (N * k_B * T / (area*(sigma**2))) + (virial / (d * area))
147
       P_{ideal} = (N * k_B *T) / (area*(sigma**2))
148
149
```

```
150
       pressure_diff = pressure - P_ideal
151
       t_values.append(t)
152
       E_values.append(total_energy)
153
       P_values.append(pressure)
154
      momentum_values.append(total_momentum)
155
156
       pressure_diff_values.append(pressure_diff)
       #PRINT(F"{T:6.2F} {TOTAL_ENERGY:12.4F} {TOTAL_MOMENTUM:12.4F} {2*kE*MASS*(1.57E2)**2/ (N
157
            * K_B):12.4E} {PRESSURE:12.4E}")
       T_values.append(T*1.65e-21)
       t += dt
160
161 plt.figure(figsize=(12, 8))
163 plt.subplot(2, 1, 1)
164 plt.plot(t_values, E_values, label='Total_Energy_(E)', color='blue')
165 plt.ylim(np.min(E_values)-10, np.max(E_values)+10)
166 plt.xlabel('Time_(t)')
plt.ylabel('Total_Energy_(E)')
168 plt.title('Total_Energy_vs_Time')
169 plt.grid(True)
170 plt.legend()
172 plt.subplot(2, 1, 2)
173 plt.plot(t_values, momentum_values, label='Total_Momentum', color='red')
174 plt.ylim(0,10*np.max(momentum_values))
175 plt.xlabel('Time_(t)')
176 plt.ylabel('Total_Momentum')
177 plt.title('Total_Momentum_vs_Time')
178 plt.grid(True)
179 plt.legend()
181 plt.tight_layout()
182 plt.show()
184 plt.figure(figsize=(12, 8))
186 plt.subplot(2, 1, 1)
187 plt.plot(t_values, T_values, label='Temperature', color='blue')
188 T_mean = np.mean(T_values)
189 plt.axhline(y=T_mean, color='red', linestyle='--', label=f'Mean_Temperature_=_{T_mean:.2f}')
190 plt.xlabel('Time<sub>□</sub>(t)')
191 plt.ylabel('Temperature')
192 plt.title('Temperature vs Time')
193 plt.grid(True)
194 plt.legend()
195
```

```
196 plt.subplot(2, 1, 2)
197 plt.plot(t_values, P_values, label='Pressure', color='red')
198 plt.xlabel('Time<sub>□</sub>(t)')
199 plt.ylabel('Pressure')
200 plt.title('Pressure vs Time')
201 plt.grid(True)
202 plt.legend()
203
204 plt.tight_layout()
205 plt.show()
207 plt.figure(figsize=(10, 6))
208 plt.plot(t_values, pressure_diff_values, label="Pressure_Difference_(Simulation_-_Ideal)")
209 plt.ylim(np.min(pressure_diff_values)-1,np.max(pressure_diff_values)+1)
210 plt.xlabel('Time_(s)')
211 plt.ylabel('Pressure_Difference_(Pa)')
{\tt 212} \  \, \textbf{plt.title('Difference\_Between\_Simulation\_Pressure\_and\_Ideal\_Gas\_Pressure')}
213 plt.legend()
214 plt.grid(True)
215 plt.show()
```

#### c题代码如下

```
1 import numpy as np
 2 import matplotlib.pyplot as plt
 4 \text{ sigma} = 3.4e-10
 5 epsilon = 1.65e-21
 6 \text{ mass} = 6.69e-26
 7 tau = sigma * np.sqrt(mass / epsilon)
 8 k_B = 1.38e-23
10 dt = 0.005
11 dt2 = dt**2
12 N = 18
13 Lx, Ly = 12.0, 6.0
14 k_B = 1.38e-23
15 temperature = 100
16 \text{ m} = 1
17 area = Lx * Ly
19 def create_lattice(N, Lx, Ly):
      positions = np.zeros((N, 2))
20
      num_rows = int(np.sqrt(N))
21
      num_cols = int(np.ceil(N / num_rows))
22
      x_spacing = Lx / num_cols
```

```
24
      y_spacing = Ly / num_rows
25
      index = 0
26
      for row in range(num_rows):
27
          for col in range(num_cols):
28
             if index >= N:
29
30
                 break
             x_pos = (col + 0.5) * x_spacing
31
             y_pos = (row + 0.5) * y_spacing
             positions[index] = [x_pos, y_pos]
             index += 1
      return positions
35
36
37 def init_velocity(N, temperature, mass):
      stddev = np.sqrt(k_B * temperature / mass)
38
      velocities = np.random.normal(0, stddev, (N, 2))
39
      velocities -= np.mean(velocities, axis=0)
40
      return velocities
41
43 positions = create_lattice(N, Lx, Ly)
44 velocities = init_velocity(N, temperature, m)
46 x, y = positions[:, 0], positions[:, 1]
47 vx, vy = velocities[:, 0], velocities[:, 1]
48 ax = np.zeros(N)
49 ay = np.zeros(N)
51 plt.figure(figsize=(6, 6))
52 plt.scatter(x, y, c='blue', label='Particles', s=100)
53 plt.xlim(0, Lx)
54 plt.ylim(0, Ly)
55 plt.gca().set_aspect('equal', adjustable='box')
56 plt.xlabel('X_Position_(Å)')
57 plt.ylabel('Y⊔Position⊔(Å)')
58 plt.title('Particle_Positions_in_6x6_Box')
59 plt.grid(color='gray', linestyle='--', linewidth=0.5)
60 plt.legend()
61 plt.show()
62
64 def check_momentum(vx, vy):
      vx -= np.sum(vx) / N
65
      vy -= np.sum(vy) / N
66
      return vx, vy
67
68
69 def pbc(pos, L):
      return (pos + L) % L
```

```
71
72 def separation(ds, L):
      return ds - L * np.round(ds / L)
74
75 def force(dx, dy):
      r2 = dx**2 + dy**2
      if r2 == 0:
          return 0, 0, 0
78
      rm2 = 1.0 / r2
79
      rm6 = rm2**3
      f_{over_r} = 24 * rm6 * (2 * rm6 - 1) * rm2
      fx = f_over_r * dx
82
      fy = f_over_r * dy
83
      pot = 4.0 * (rm6**2 - rm6)
84
      return fx, fy, pot
85
86
87 def accel(x, y, ax, ay):
      ax.fill(0)
88
      ay.fill(0)
89
      pe = 0.0
90
      virial = 0.0
      for i in range(N - 1):
          for j in range(i + 1, N):
93
              dx = separation(x[i] - x[j], Lx)
94
             dy = separation(y[i] - y[j], Ly)
95
             fx, fy, pot = force(dx, dy)
96
             ax[i] += fx
97
             ay[i] += fy
98
              ax[j] -= fx
99
             ay[j] -= fy
100
              pe += pot
101
102
             virial += dx * fx + dy * fy
      return pe, virial
103
105 def verlet(x, y, vx, vy, ax, ay):
      x += vx * dt + 0.5 * ax * dt2
      y += vy * dt + 0.5 * ay * dt2
      x = pbc(x, Lx)
108
      y = pbc(y, Ly)
109
      vx += 0.5 * ax * dt
110
      vy += 0.5 * ay * dt
111
      pe, virial = accel(x, y, ax, ay)
112
      vx += 0.5 * ax * dt
113
      vy += 0.5 * ay * dt
114
      ke = 0.5 * m * np.sum(vx**2 + vy**2)
115
      return ke, pe, virial
116
117
```

```
118 def compute_momentum(vx, vy):
       px = np.sum(m * vx)
119
       py = np.sum(m * vy)
120
       total_momentum = np.sqrt(px**2 + py**2)
121
       return total_momentum
122
123
124 n_t_values = []
125 left_half = Lx / 2
127 t = 0.0
128 while t < 300.0:
       ke, pe, virial = verlet(x, y, vx, vy, ax, ay)
129
130
       n_t = np.sum(x < left_half)</pre>
131
      n_t_values.append(n_t)
132
133
       t += dt
135 n_t_values = n_t_values[0:60000]
137 t_values = np.arange(0, 300.0, dt)
138 print(len(t_values))
140 n_t_mean = []
142 for i in range(len(t_values)):
       n_t_mean.append(np.mean(n_t_values[0:i]))
143
144
145 plt.figure(figsize=(16, 6))
146 plt.plot(t_values, n_t_values, label='\$n(t)\$:\_Number_of\_particles\_in\_left\_half')
147 plt.xlabel('Time_(t)')
148 plt.ylabel('$n(t)$')
149 plt.title('Number_of_Particles_in_Left_Half_vs_Time')
150 plt.legend()
151 plt.grid(True)
152 plt.show()
154 plt.figure(figsize=(16, 6))
155 plt.plot(t_values, n_t_mean, label='$n(t)$:_Average_number_of_particles_in_left_half')
156 plt.xlabel('Time<sub>□</sub>(t)')
157 plt.ylabel('$n(t)$')
158 plt.title('Average_Number_of_Particles_in_Left_Half_vs_Time')
159 plt.legend()
160 plt.grid(True)
161 plt.show()
print(f"Time-averaged_number_of_particles_in_left_half:_{\parallel}\{n_t_mean:.2f\}")
```

### **Problem 2**

#### **Ising Model**

# a. 可以看到 $T_c$ 随着材料扩大,逐渐逼近无限大系统的相变温度,大约在 2.35 附近

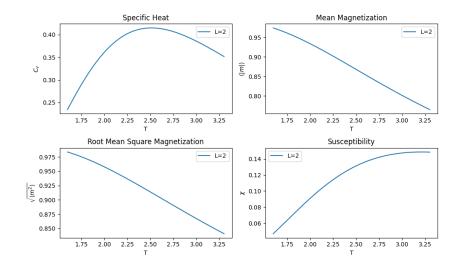


图 12: L=2

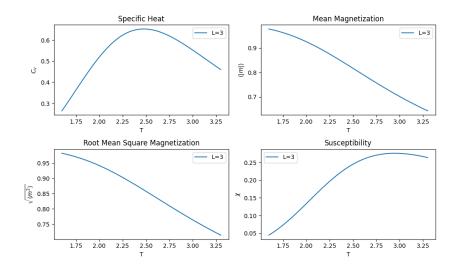


图 13: L=3

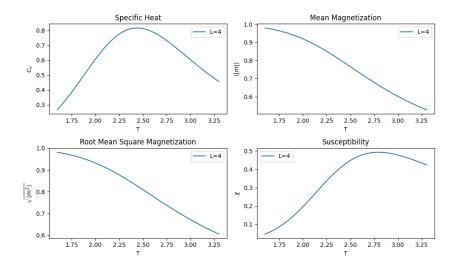


图 14: L=4

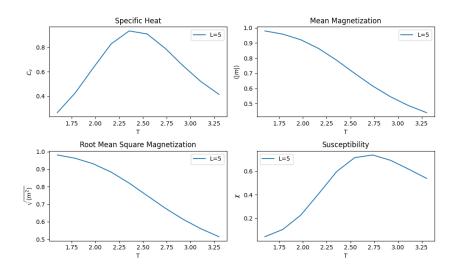


图 15: L=5

```
import numpy as np
import matplotlib.pyplot as plt
from itertools import product

J = 1.0
L_values = [2,3,4,5]
T_range = np.linspace(1.6, 3.3, 10)

def compute_ising_properties(L, T_range):

N = L * L
print(1)
states = np.array(list(product([-1, 1], repeat=N)))
```

```
15
      print(states)
      E_values = []
16
      M_values = []
17
18
      for state in states:
19
          state = state.reshape(L, L)
20
         E = 0
21
         M = np.sum(state)
22
          for i in range(L):
             for j in range(L):
                 E = J * state[i, j] * (state[(i + 1) % L, j] + state[i, (j + 1) % L])
25
          E_values.append(E)
26
          M_values.append(M)
27
      E_values = np.array(E_values)
28
      M_values = np.array(M_values)
29
30
      results = {"Cv": [], "m_mean": [], "sqrt_m2": [], "m_max": [], "chi": []}
31
      for T in T_range:
32
         beta = 1 / T
33
          Z = np.sum(np.exp(-beta * E_values))
34
35
          E_mean = np.sum(E_values * np.exp(-beta * E_values)) / Z
          E2_mean = np.sum((E_values ** 2) * np.exp(-beta * E_values)) / Z
36
          M_mean = np.sum(np.abs(M_values) * np.exp(-beta * E_values)) / Z
37
          M2_mean = np.sum((M_values ** 2) * np.exp(-beta * E_values)) / Z
38
         M_max = np.max(np.abs(M_values))
39
40
          Cv = (E2_mean - E_mean ** 2) * beta ** 2 / N
41
          chi = (M2_mean - M_mean ** 2) * beta / N
42
43
          results["Cv"].append(Cv)
44
          results["m_mean"].append(M_mean / N)
45
          results["sqrt_m2"].append(np.sqrt(M2_mean) / N)
46
          results["m_max"].append(M_max / N)
47
          results["chi"].append(chi)
48
      return results
49
52 for L in [1]:
      results = compute_ising_properties(5, T_range)
53
      plt.figure(figsize=(10, 6))
54
55
      # 绘制 Cv
56
      plt.subplot(2, 2, 1)
57
      plt.plot(T_range, results["Cv"], label=f"L={L}")
58
      plt.xlabel("T")
59
      plt.ylabel("$C_v$")
60
      plt.title("Specific_Heat")
```

```
plt.legend()
62
63
      # 绘制 <|M|>
64
      plt.subplot(2, 2, 2)
65
      plt.plot(T_range, results["m_mean"], label=f"L={L}")
66
      plt.xlabel("T")
      plt.ylabel("$\\langle_\|m|_\\rangle$")
      plt.title("Mean_Magnetization")
      plt.legend()
70
      # 绘制 SQRT(<M^2>)
      plt.subplot(2, 2, 3)
73
      plt.plot(T_range, results["sqrt_m2"], label=f"L={L}")
74
      plt.xlabel("T")
75
      plt.ylabel("$\\sqrt{\\langle_m^2_\\rangle}$")
76
      {\tt plt.title("Root_{\sqcup}Mean_{\sqcup}Square_{\sqcup}Magnetization")}
77
      plt.legend()
78
79
      # 绘制 CHI
80
      plt.subplot(2, 2, 4)
      plt.plot(T_range, results["chi"], label=f"L={L}")
      plt.xlabel("T")
      plt.ylabel("$\\chi$")
      plt.title("Susceptibility")
85
      plt.legend()
86
87
      plt.tight_layout()
88
      plt.show()
```

b. 可以看到  $T_c$  随着材料扩大逼近大约 2.25 附近的过程,其中 L=128 的图片由于材料较大,在有限计算资源下难以达到接近平衡态的状态,进而出现多个峰值,可以估计出真实峰值应该接近 2.25。

蒙特卡洛模拟参数: 10000 步 MC 来达到平衡态, 之后 5000 步进行测量。由于 L=64、L=128 的材料尺寸很大, 在这个 MC 模拟参数下运算一次需要很长时间, 且计算资源有限, 因此没有设置更大的模拟参数, 如果计算资源足够可以设置更大参数, 得到更准确结果。

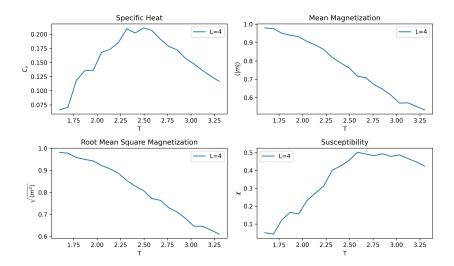


图 16: L=4

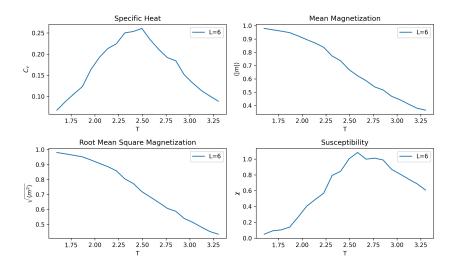


图 17: L=6

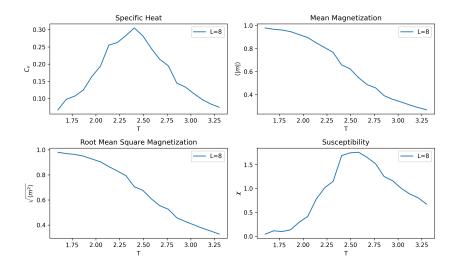


图 18: L=8

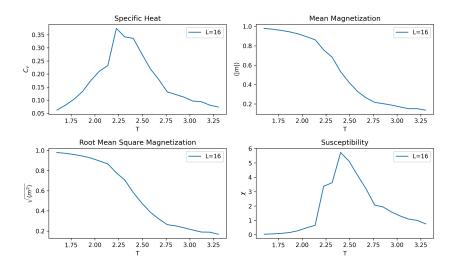


图 19: L=16

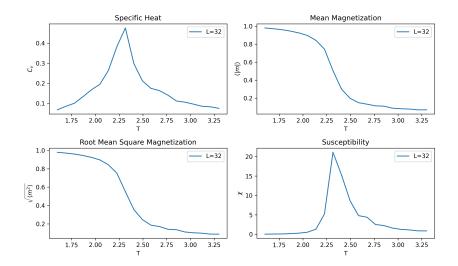


图 20: L=32

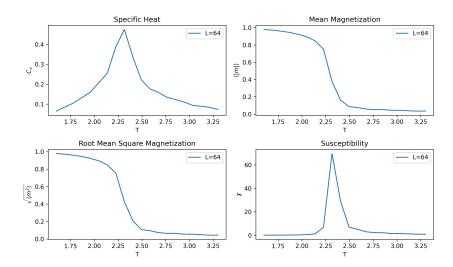


图 21: L=64

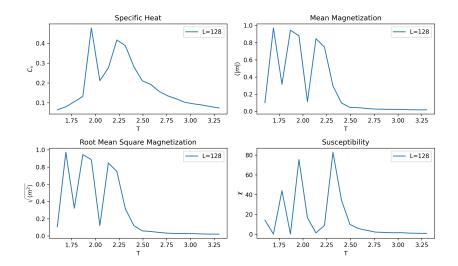


图 22: L=128

```
1 import numpy as np
 2 import matplotlib.pyplot as plt
 4 J = 1.0
 5 L_values = [4, 6, 8, 10, 16, 32, 64, 128]
 6 T_range = np.linspace(1.6, 3.3, 20)
 7 MCS = 100
 8 measurements = 50
10
  def metropolis_step(spins, beta, L):
11
12
      for _ in range(L * L):
13
          i, j = np.random.randint(0, L), np.random.randint(0, L)
14
          dE = 2 * J * spins[i, j] * (
                 spins[(i + 1) % L, j] + spins[i, (j + 1) % L] +
                 spins[(i - 1) % L, j] + spins[i, (j - 1) % L]
18
          if dE <= 0 or np.random.rand() < np.exp(-beta * dE):</pre>
19
             spins[i, j] *= -1
20
21
22
  def monte_carlo_simulation(L, T_range, MCS, measurements):
23
24
      N = L * L
25
      results = {"Cv": [], "m_mean": [], "sqrt_m2": [], "m_max": [], "chi": []}
26
27
      for T in T_range:
28
          beta = 1 / T
29
          spins = np.random.choice([-1, 1], size=(L, L))
```

```
E_values = []
31
          M_values = []
32
33
          for _ in range(MCS):
34
             metropolis_step(spins, beta, L)
35
36
37
          for _ in range(measurements):
             metropolis_step(spins, beta, L)
38
             E = -J * np.sum(spins * (
                     np.roll(spins, 1, axis=0) +
40
41
                     np.roll(spins, 1, axis=1)
             )) / 2
42
             M = np.sum(spins)
43
             E_values.append(E)
44
             M_values.append(M)
45
46
          E_values = np.array(E_values)
47
          M_values = np.array(M_values)
48
          E_mean = np.mean(E_values)
49
          E2_mean = np.mean(E_values ** 2)
50
51
          M_mean = np.mean(np.abs(M_values))
          M2_mean = np.mean(M_values ** 2)
53
          Cv = beta ** 2 * (E2_mean - E_mean ** 2) / N
          chi = beta * (M2_mean - M_mean ** 2) / N
55
         m_max = np.max(np.abs(M_values)) / N
56
57
          results["Cv"].append(Cv)
58
          results["m_mean"].append(M_mean / N)
59
          results["sqrt_m2"].append(np.sqrt(M2_mean) / N)
60
          results["m_max"].append(m_max)
61
          results["chi"].append(chi)
62
63
64
      return results
65
67 for L in L_values:
      print(f"Running_simulation_for_L_=_{L}L}...")
68
      results = monte_carlo_simulation(L, T_range, MCS, measurements)
69
70
      plt.figure(figsize=(10, 6))
71
72
      # 绘制 Cv
73
      plt.subplot(2, 2, 1)
74
      plt.plot(T_range, results["Cv"], label=f"L={L}")
75
      plt.xlabel("T")
76
      plt.ylabel("$C_v$")
77
```

```
plt.title("Specific_Heat")
78
       plt.legend()
79
80
       # 绘制 <|M|>
81
       plt.subplot(2, 2, 2)
82
       plt.plot(T_range, results["m_mean"], label=f"L={L}")
83
       plt.xlabel("T")
       plt.ylabel("$\\langle_|m|_\\rangle$")
85
       plt.title("Mean_Magnetization")
86
       plt.legend()
87
88
       # 绘制 SQRT(<M^2>)
89
       plt.subplot(2, 2, 3)
90
       {\tt plt.plot(T\_range, results["sqrt\_m2"], label=f"L=\{L\}")}
91
       plt.xlabel("T")
92
       plt.ylabel("$\\sqrt{\\langle_m^2_\\rangle}$")
93
       {\tt plt.title("Root_{\sqcup}Mean_{\sqcup}Square_{\sqcup}Magnetization")}
94
       plt.legend()
95
96
       # 绘制 CHI
97
98
       plt.subplot(2, 2, 4)
       plt.plot(T_range, results["chi"], label=f"L={L}")
       plt.xlabel("T")
100
       plt.ylabel("$\\chi$")
101
       plt.title("Susceptibility")
102
       plt.legend()
103
104
       plt.tight_layout()
105
       plt.show()
106
```