

01. Introduction to the PIC simulation

02. Random number generation and its application

## **Particle-in-Cell (PIC) kinetic simulations**

### **03. Particle weighting and normalization**

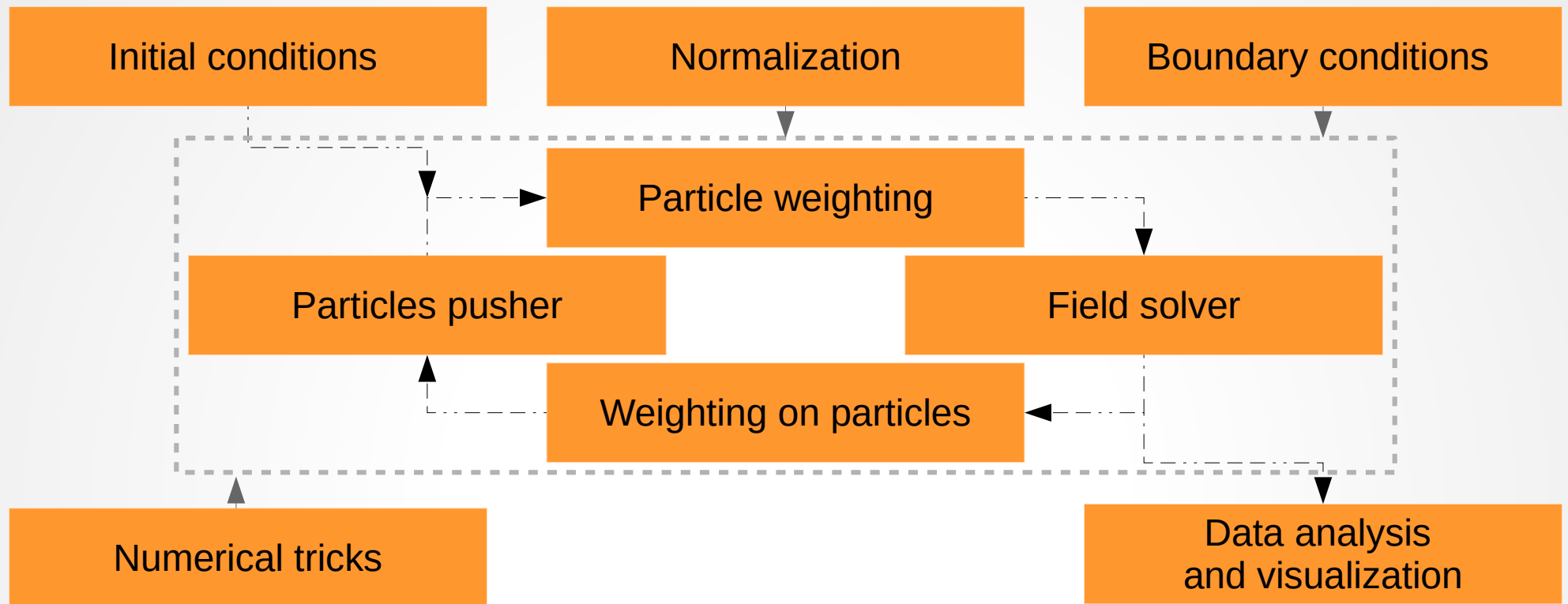
**Chun-Sung Jao ( 饒駿頌 )**

Assistant Research Scholar,  
Institute of Space Science and Engineering,  
National Central University, Taiwan

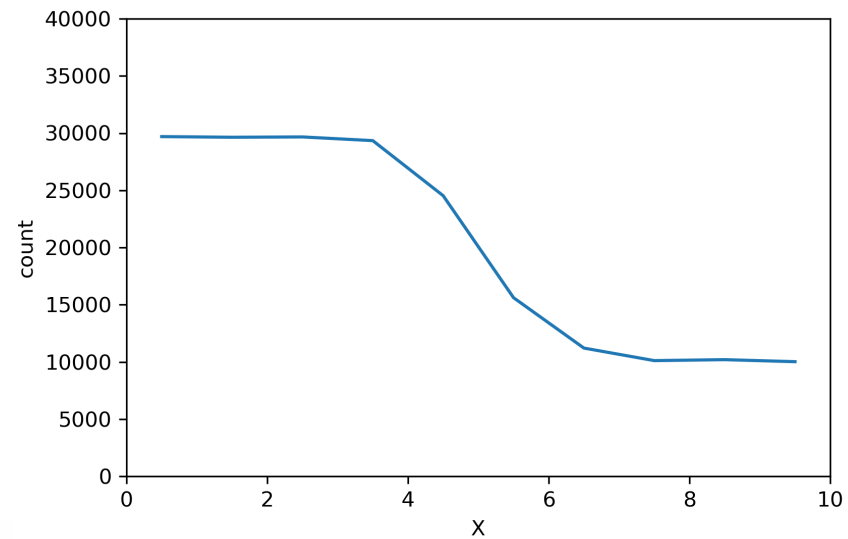
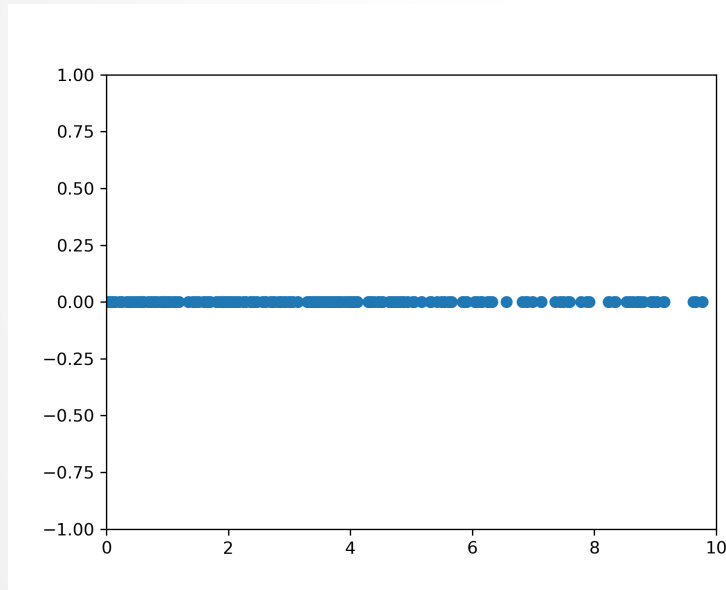
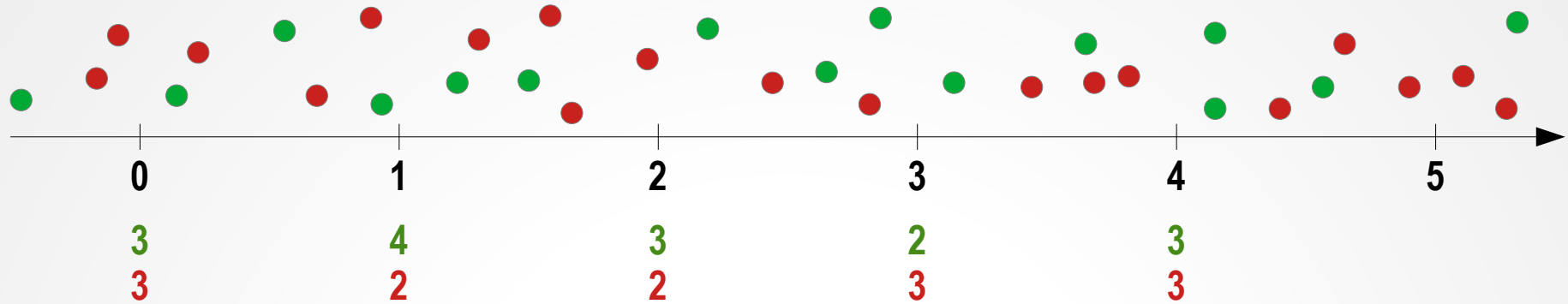
University of São Paulo, 2019.11.25-12.06

[www.slido.com](https://www.slido.com) code: #P320

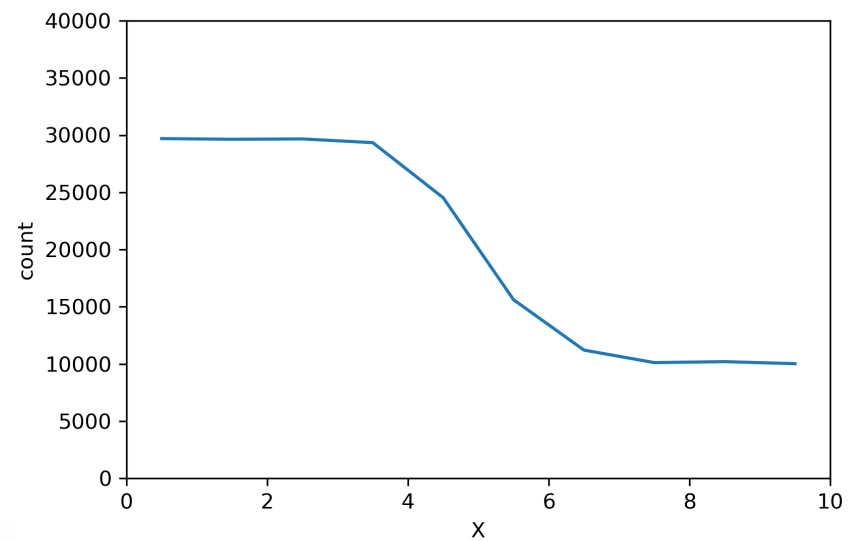
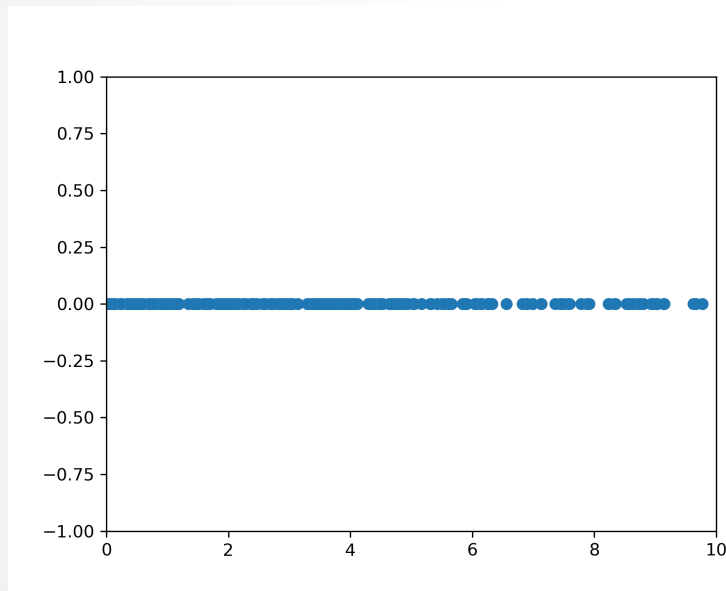
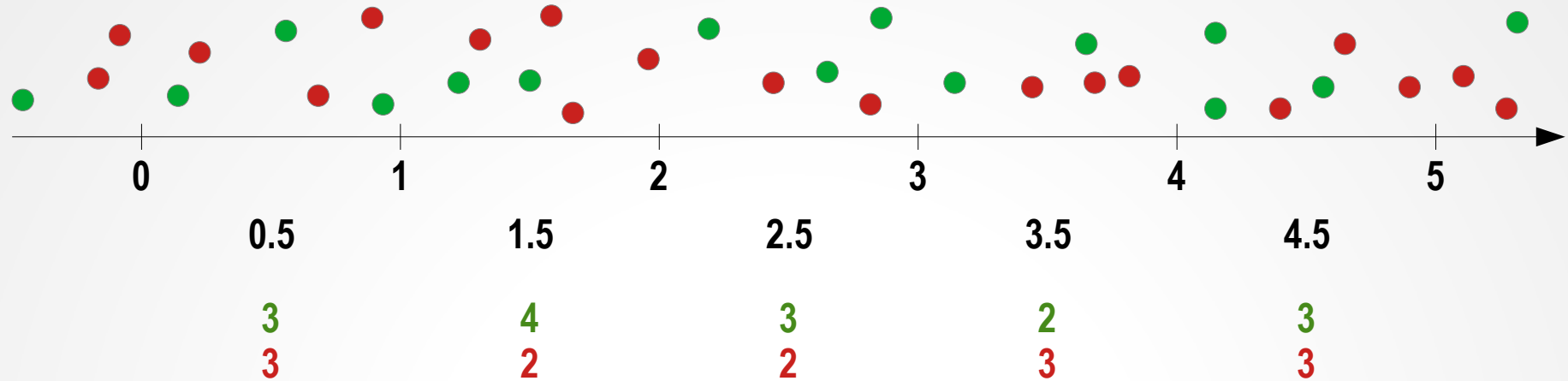
# Concept and basic structure



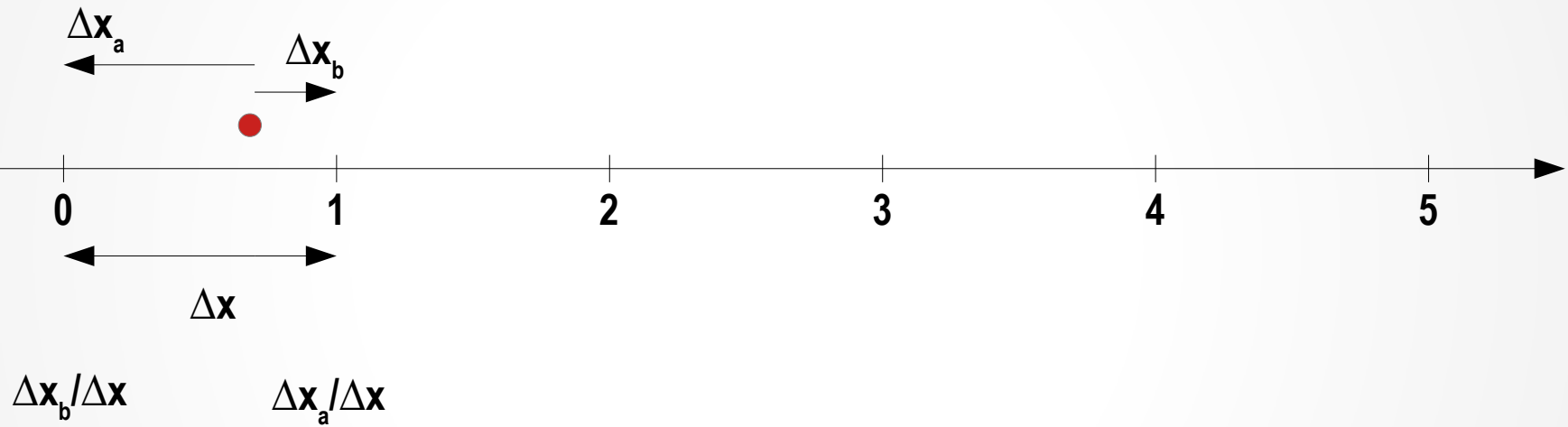
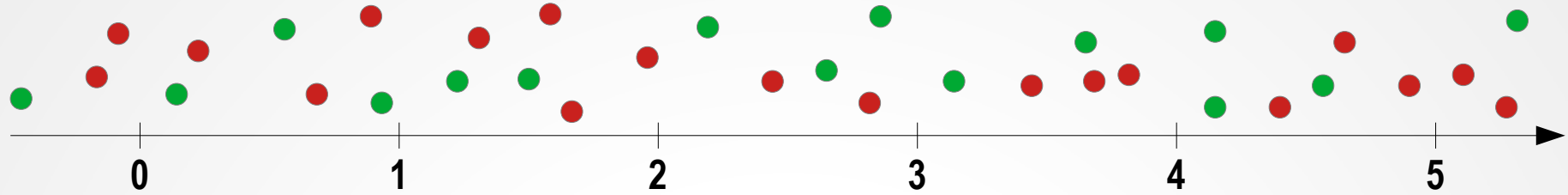
# Particle weighting 1D: from continuous data to discrete data



# Particle weighting 1D: from continuous data to discrete data

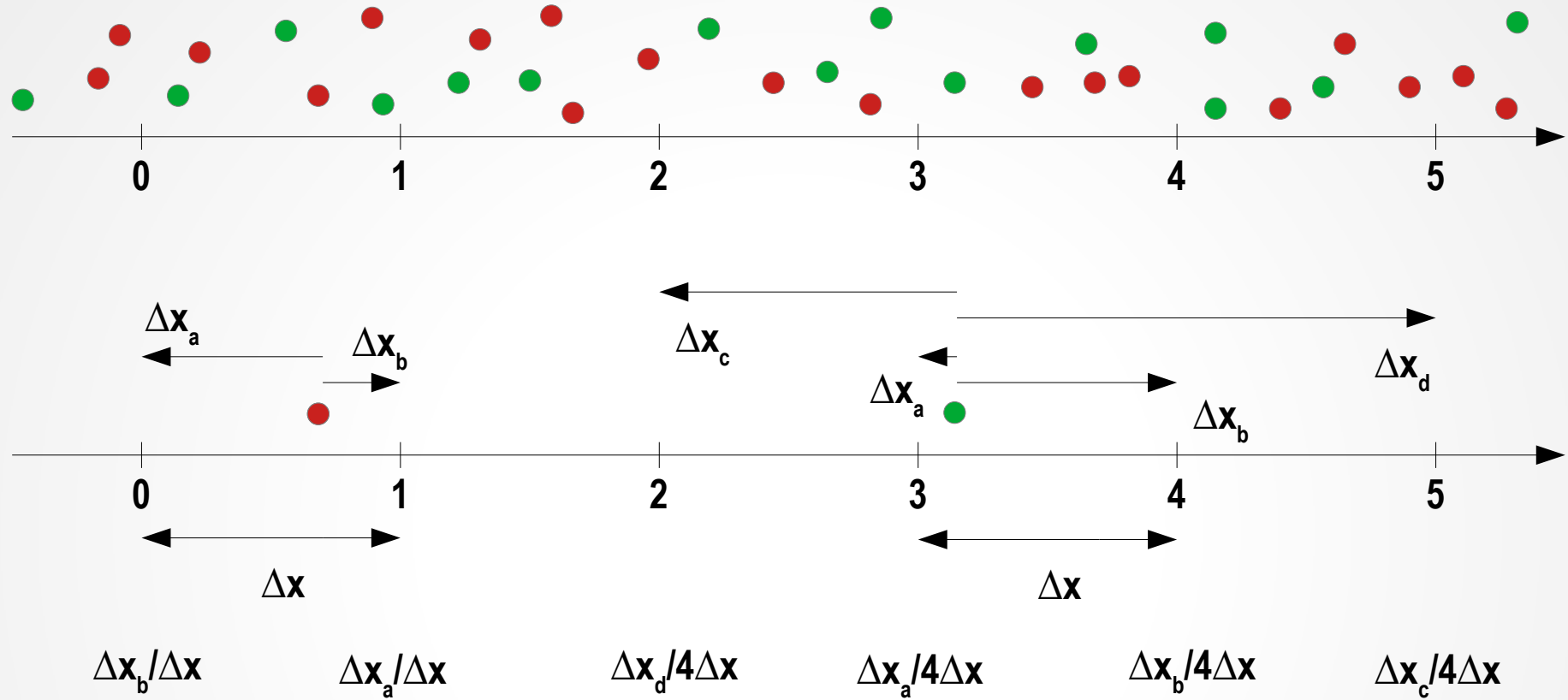


# Particle weighting 1D: from continuous data to discrete data

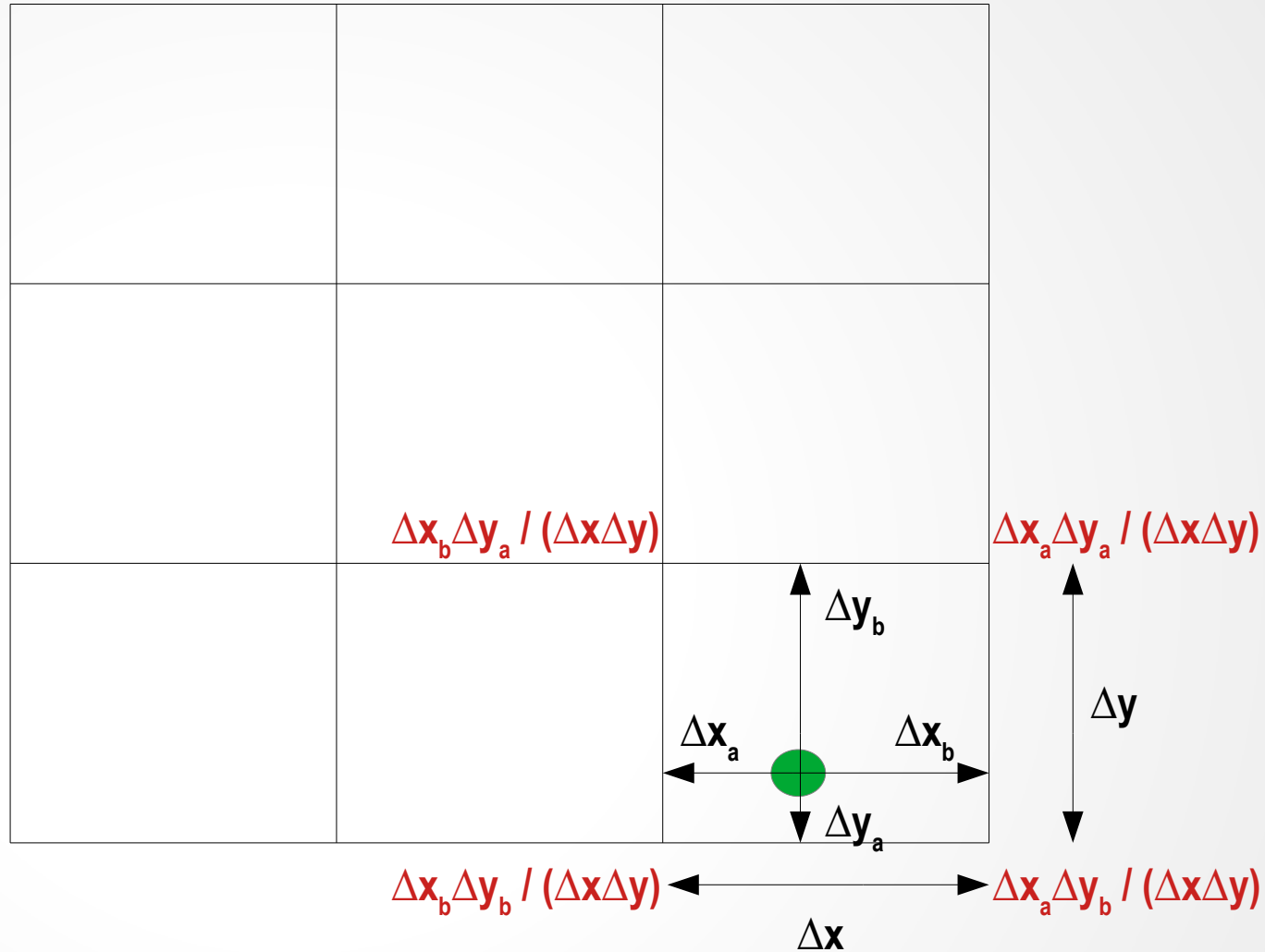
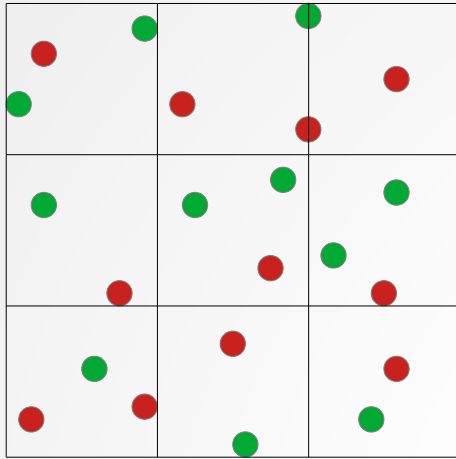


Linear interpolation

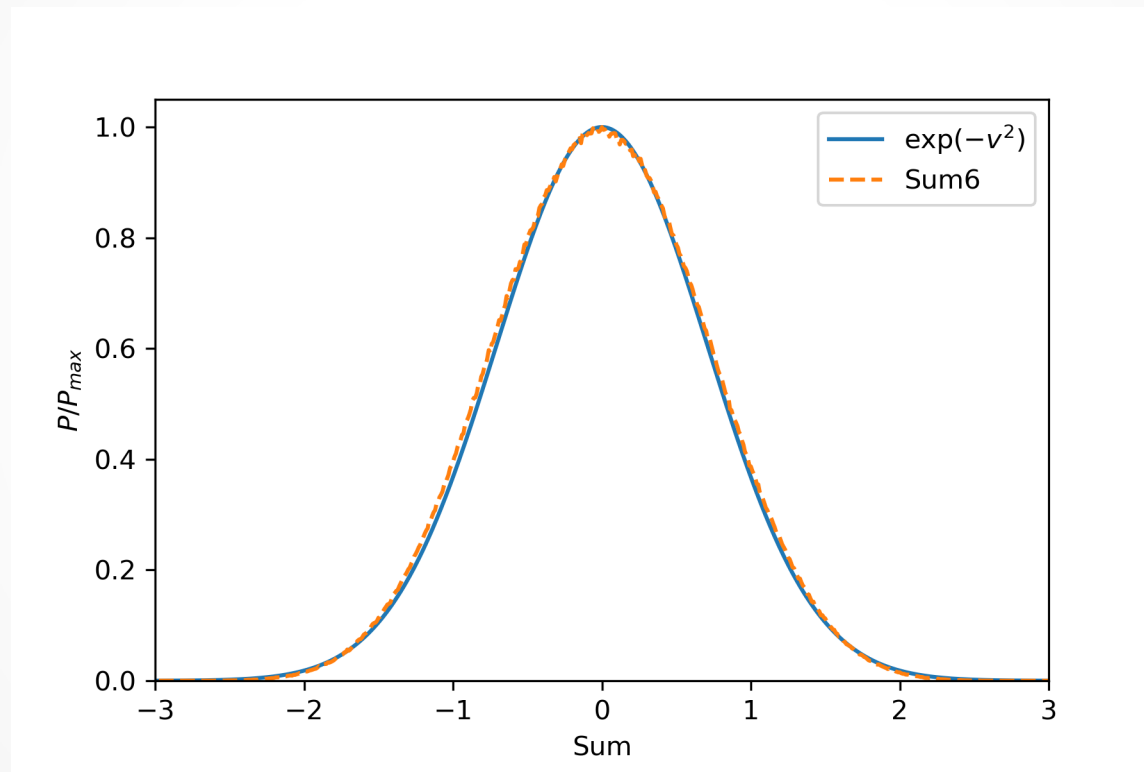
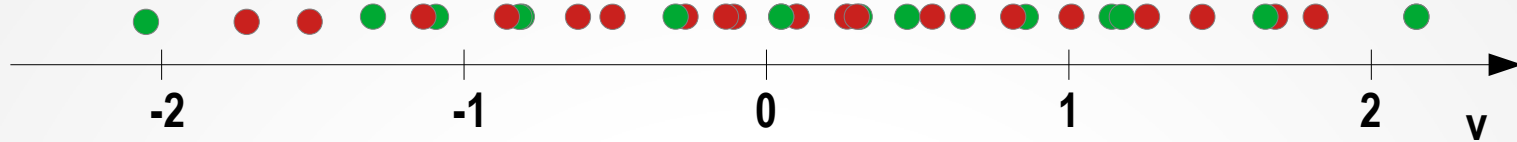
# Particle weighting 1D: from continuous data to discrete data



# Particle weighting 2D: from continuous data to discrete data

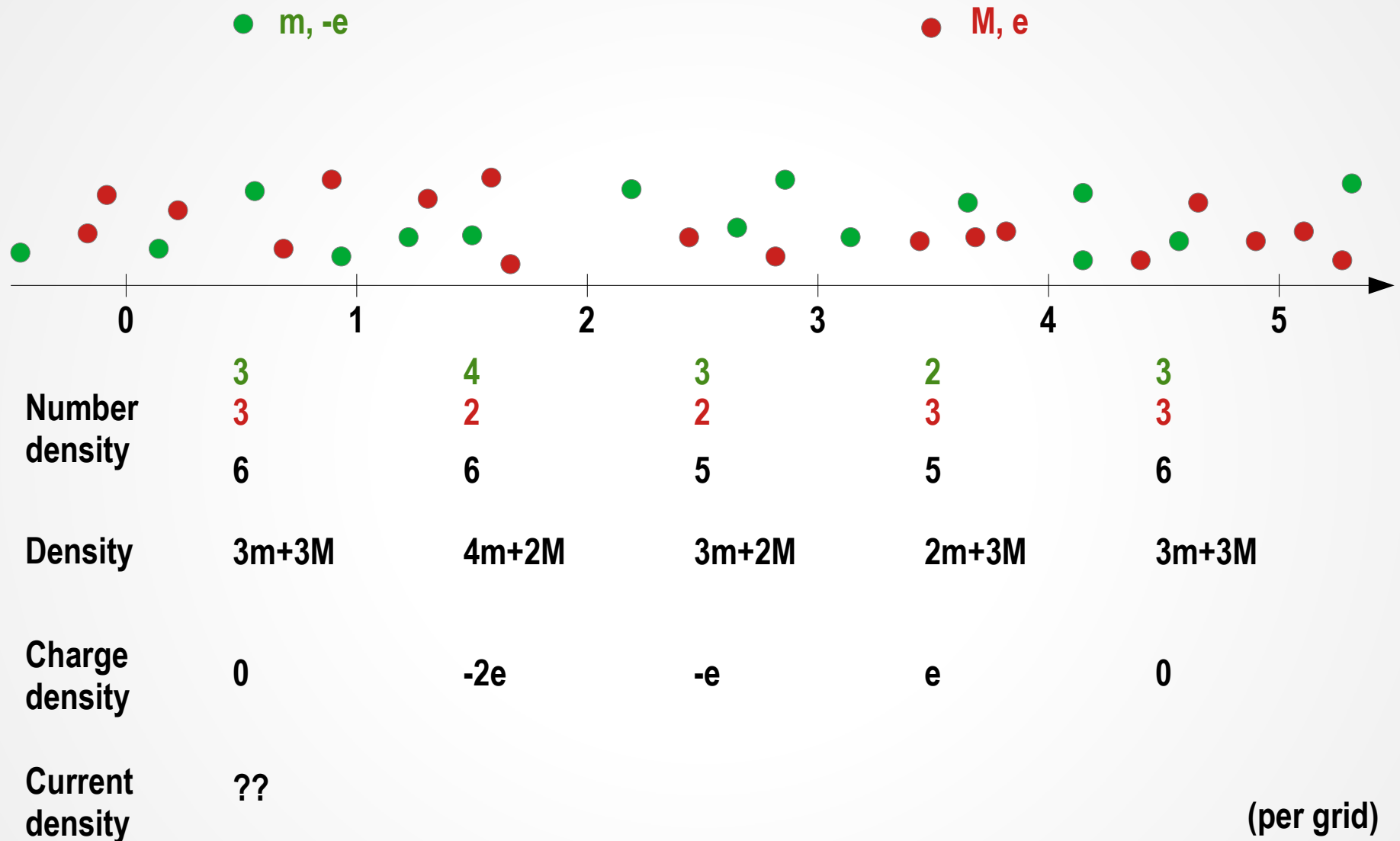


# Particle weighting: velocity distribution

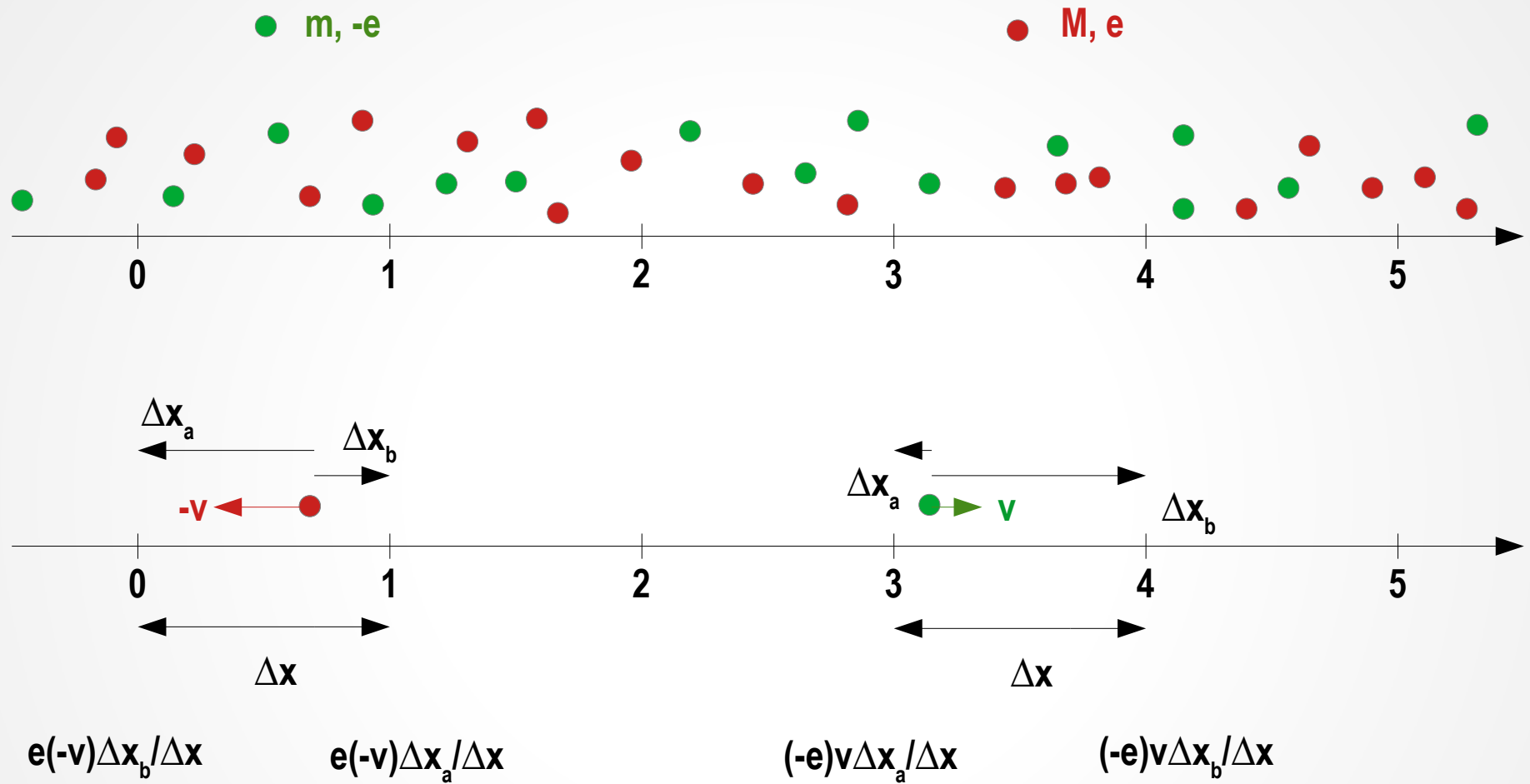




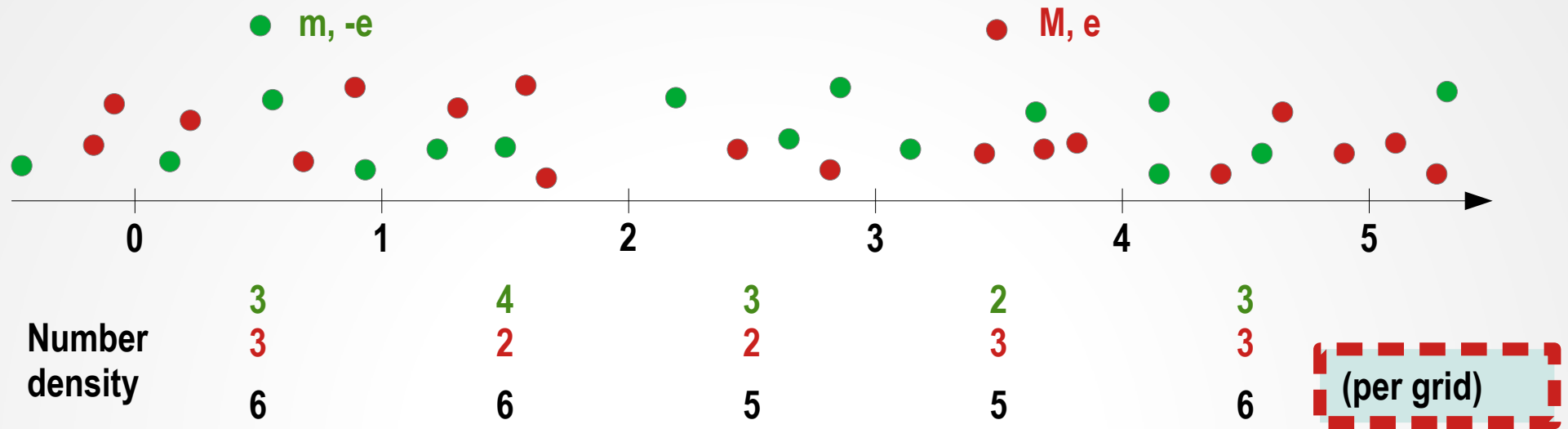
# Particle weighting 1D: from continuous data to discrete data



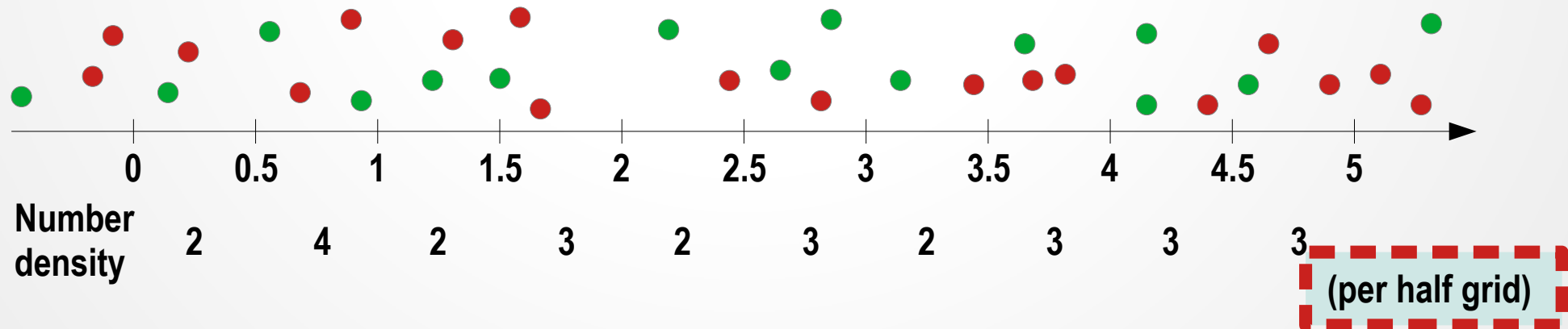
# Particle weighting 1D: from continuous data to discrete data



# Normalization



We have to define the unit here!!  
 km? m? cm? **dimensionless units?**



# Dimensionless units

## Length

AU, km, m cm... → Debye length, skin length, ion inertial length...

## Time

Yr, s... → inverse of plasma frequency, inverse of Larmor frequency...

## Velocity

m/s → speed of light, thermal velocity, Alfven speed...

**L=8??**

**T=120??**

**v=0.03**

# Normalization

## Length

AU, km, m cm... → Debye length, skin length, **ion inertial length...**  
 $c / \omega_{pi}$

## Time

Yr, s... → inverse of ion plasma frequency, inverse of Larmor frequency...  
 $\omega_{pi}$

## Velocity

m/s → **speed of light**, thermal velocity, Alfven speed.  
 $c$

# Normalization

## Length

AU, km, m cm... → Debye length, skin length, ion inertial length,  $\frac{mv_{th,e}}{eB}$

## Time

Yr, s... → inverse of plasma frequency, **inverse of Larmor frequency...**  
 $(eB/m)^{-1}$

## Velocity

m/s → speed of light, **thermal velocity**, Alfven speed...  
 $v_{th,e}$

# Normalization

## Length

AU, km, m cm... → Debye length, skin length, ion inertial length,  $\frac{mc}{eB}$

## Time

Yr, s... → inverse of plasma frequency, **inverse of Larmor frequency...**  
 $(eB/m)^{-1}$

## Velocity

m/s → **speed of light**, thermal velocity, Alfven speed...  
 $c$

# Normalization

## Length

Debye length, **skin length**, ion inertial length...

$$c/\omega_{pe} = 1.0,$$

$$\omega_{pe} = 1.0,$$

## Time

**inverse of plasma frequency**, inverse of Larmor frequency...

## Velocity

speed of light, thermal velocity, Alfven speed...

In our simulation, the length of simulation system is  $1024 c/\omega_{pe}$  and the time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted.



# Normalization

## Length

Debye length, **skin length**, ion inertial length...

$$c/\omega_{pe} = 1.0,$$

$$\omega_{pe} = 1.0,$$

$$\omega_{pe}/\omega_{ce} = 0.1 = v_A/c,$$

## Time

**inverse of plasma frequency**, inverse of Larmor frequency...

## Velocity

speed of light, thermal velocity, Alfven speed...

In our simulation, the length of simulation system is  $1024 c/\omega_{pe}$  and the time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted. The frequency ratio  $\omega_{pe}/\omega_{ce} = 0.1$ .

# Normalization

## Length

Debye length, **skin length**, ion inertial length...

$$c/\omega_{pe} = 1.0,$$

$$\omega_{pe} = 1.0,$$

$$\omega_{pe}/\omega_{ce} = 0.1 = v_A/c,$$

$$\omega_{be}/\omega_{pe} = 0.04 = \text{sqrt}(n_b/n_e),$$

## Time

**inverse of plasma frequency**, inverse of Larmor frequency...

## Velocity

speed of light, thermal velocity, Alfven speed...

In our simulation, the length of simulation system is  $1024 c/\omega_{pe}$  and the time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted. The frequency ratio  $\omega_{pe}/\omega_{ce} = 0.1$ . The ratio of plasma frequency between beam electrons and background electrons is  $\omega_{be}/\omega_{pe} = 0.04$ .

# Normalization

## Length

Debye length, **skin length**, ion inertial length...

$$c/\omega_{pe} = 1.0,$$

$$\omega_{pe} = 1.0,$$

$$\omega_{pe}/\omega_{ce} = 0.1 = v_A/c,$$

$$\omega_{be}/\omega_{pe} = 0.04 = \text{sqrt}(n_b/n_e),$$

## Time

**inverse of plasma frequency**, inverse of Larmor frequency...

## Velocity

speed of light, thermal velocity, Alfven speed...

In our simulation, the length of simulation system is  $1024 c/\omega_{pe}$  and the time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted. The frequency ratio  $\omega_{pe}/\omega_{ce} = 0.1$ . The ratio of plasma frequency between beam electrons and background electrons is  $\omega_{be}/\omega_{pe} = 0.04$ .

# Normalization

The speed of light is set as  $c = 1$  in our simulation, and the electric constant  $\epsilon_0 = 1$ .

$$c = 1.0, \epsilon_0 = 1.0 \quad \rightarrow \quad \mu_0 = 1.0$$

# Normalization

The speed of light is set as  $c = 1$  in our simulation, and the electric constant  $\epsilon_0 = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted, where  $\omega_{pe}$  is the plasma frequency of background electrons.

$$\begin{aligned} c = 1.0, \epsilon_0 = 1.0 & \rightarrow \mu_0 = 1.0 \\ \omega_{pe} = 1.0, & \rightarrow c / \omega_{pe} = 1.0 \end{aligned}$$

# Normalization

The speed of light is set as  $c = 1$  in our simulation, and the electric constant  $\epsilon_0 = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted, where  $\omega_{pe}$  is the plasma frequency of background electrons.  $\Delta x = 0.1 c / \omega_{pe}$  and 10 particle per cell is used.

$$\begin{aligned} c = 1.0, \epsilon_0 = 1.0 & \rightarrow \mu_0 = 1.0 \\ \omega_{pe} = 1.0, & \rightarrow c / \omega_{pe} = 1.0 \\ N_0 / (c / \omega_{pe}) = 100 & \rightarrow n_0 = 100 \end{aligned}$$

# Normalization

The speed of light is set as  $c = 1$  in our simulation, and the electric constant  $\epsilon_0 = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  is adopted, where  $\omega_{pe}$  is the plasma frequency of background electrons.  $\Delta x = 0.1 c/\omega_{pe}$  and 10 particle per cell is used. The mass-to-charge ratio of background electron is set as  $m_e/e = 1.0$ .

$$\begin{aligned} c = 1.0, \epsilon_0 = 1.0 & \rightarrow \mu_0 = 1.0 \\ \omega_{pe} = 1.0, & \rightarrow c / \omega_{pe} = 1.0 \\ N_0 / (c/\omega_{pe}) = 100 & \rightarrow n_0 = 100 \\ m_e/e = 1.0 & \rightarrow e = 1/100 \end{aligned}$$

$$\omega_{pe} = \text{sqrt}(n_0 e^2 / m \epsilon_0) = \text{sqrt}(100e) = 1.0$$

## Parameter table

E10	=SQRT(E8*1.5/(I2*E2*I1))							
	A	B	C	D	E	F	H	I
1			electron	H+	O+		ion to electron mass	1836
2	amu			1	16		electron mass me	9.11E-31
3	Nunber density	1/m-3	2.00E+11	2.00E+11	2.00E+11		electron charge e	1.60E-19
4		1/cm-3	2.00E+05	2.00E+05	2.00E+05		permittivity of free space epsilon0	8.85E-12
5	plasma frequency Wp	1/s	25200209.81	588122.5319	147030.633		pi	3.14E+00
6	plasma period 2 pi / Wp	s	2.49E-07	1.07E-05	4.27E-05		Boltzmann constant Kb	1.38E-23
7	Temperature	K	2000	2000	2000			
8		J	2.76E-20	2.76E-20	2.76E-20			
9		eV	1.73E-01	1.73E-01	1.73E-01			
10	thermal velocity		213177.3121	4975.132409	1243.783102	m vth ^2 = 3 kb T / 2		
11								
12	Magnetic field B	T	5.00E-05					
13		mu T	5.00E+01					
14	gyro requency Wc	1/s	8.78E+06	4.78E+03	2.99E+02			
15	cyclntron period	s	7.15E-07	1.31E-03	2.10E-02			
16	gyroradius (thermal speed)	m	2.43E-02	1.04E+00	4.16E+00			
17								
18	sound speed	m/s		5744.788071	1436.197018	Cs=sqrt( (kTi + kTe) / mi)		
19	Mach number	0.6		3446.872843	861.7182107			
20	Mach number	1		5744.788071	1436.197018			
21	Mach number	1.3		7468.224493	1867.056123			
22		1.3		7468.224493				
23								



# Particle weighting and normalization: hand-on

In our simulation system, the Debye length and the plasma frequency of the background electrons are set as  $\lambda_{De} = 1.0$  and  $\omega_{pe} = 1.0$ , and the mass and the absolute charge of electrons are  $m=1$  and  $|e| = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  and grid size  $\Delta x = 0.25 \lambda_{De}$  are adopted, and the length of the simulation system is  $L = 16 \lambda_{De}$ . Both beam and background electrons have the uniform spatial distribution, and the number density ratio between the beam and background electrons is  $n_b/n_e = 1.0$ . We use 256 particles per grid for both ions and electrons. The velocity distribution of both background and beam electrons can be described as

$$F_e(v) = A \exp(-v^2 / v_{th,e}^2) \quad \text{and} \quad F_b(v) = B \exp(-(v-v_{d,b})^2 / v_{th,b}^2)$$

, respectively, where  $v_d$  is the drift velocity and  $v_{th}$  is the thermal velocity. For the electron beam, the drift velocity and thermal velocity are  $v_{d,b}/v_{th,e} = 5.0$  and  $v_{th,b}/v_{th,e} = 1.0$ .

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$$v_{th,e} / \omega_{pe} = \lambda_{De}$$

# Particle weighting and normalization: hand-on

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**The grid size is 0.25, and the length of simulation system is 16.  
There are 64 grids in the simulation system.**

# Particle weighting and normalization: hand-on

In our simulation system, the Debye length and the plasma frequency of the background electrons are set as  $\lambda_{De} = 1.0$  and  $\omega_{pe} = 1.0$ , and the mass and the absolute charge of electrons are  $m=1$  and  $|e| = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  and grid size  $\Delta x = 0.25 \lambda_{De}$  are adopted, and the length of the simulation system is  $L = 16 \lambda_{De}$ . **Both beam and background electrons have the uniform spatial distribution, and the number density ratio between the beam and background electrons is  $n_b/n_e = 1.0$ .** We use 256 particles per grid for both ions and electrons. The velocity distribution of both background and beam electrons can be described as

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**We can use the program from the course yesterday.**

# Particle weighting and normalization: hand-on

In our simulation system, the Debye length and the plasma frequency of the background electrons are set as  $\lambda_{De} = 1.0$  and  $\omega_{pe} = 1.0$ , and the mass and the absolute charge of electrons are  $m=1$  and  $|e| = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  and grid size  $\Delta x = 0.25 \lambda_{De}$  are adopted, and the length of the simulation system is  $L = 16 \lambda_{De}$ . Both beam and background electrons have the uniform spatial distribution, and the number density ratio between the beam and background electrons is  $n_b/n_e = 1.0$ . **We use 256 particles per grid for both ions and electrons.** The velocity distribution of both background and beam electrons can be described as

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**Since there are 64 grids in the simulation system, now in total we will employ 64x256 particles for beam electrons and another 64x256 particles for background electrons.**

# Particle weighting and normalization: hand-on

In our simulation system, the Debye length and the plasma frequency of the background electrons are set as  $\lambda_{De} = 1.0$  and  $\omega_{pe} = 1.0$ , and the mass and the absolute charge of electrons are  $m=1$  and  $|e| = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  and grid size  $\Delta x = 0.25 \lambda_{De}$  are adopted, and the length of the simulation system is  $L = 16 \lambda_{De}$ . Both beam and background electrons have the uniform spatial distribution, and the number density ratio between the beam and background electrons is  $n_b/n_e = 1.0$ . We use 256 particles per grid for both ions and electrons. **The velocity distribution of both background and beam electrons can be described as**

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**For initial condition:**

- 1. Create a position array with 16384 elements and a velocity array with 16384 elements to save beam particle information.**
- 2. Create a position array with 16384 elements and a velocity array with 16384 elements to save beam particle information.**

# Particle weighting and normalization: hand-on

In our simulation system, the Debye length and the plasma frequency of the background electrons are set as  $\lambda_{De} = 1.0$  and  $\omega_{pe} = 1.0$ , and the mass and the absolute charge of electrons are  $m=1$  and  $|e| = 1$ . The time interval  $\Delta t = 0.125 / \omega_{pe}$  and grid size  $\Delta x = 0.25 \lambda_{De}$  are adopted, and the length of the simulation system is  $L = 16 \lambda_{De}$ . Both beam and background electrons have the uniform spatial distribution, and the number density ratio between the beam and background electrons is  $n_b/n_e = 1.0$ . We use 256 particles per grid for both ions and electrons. The velocity distribution of both background and beam electrons can be described as

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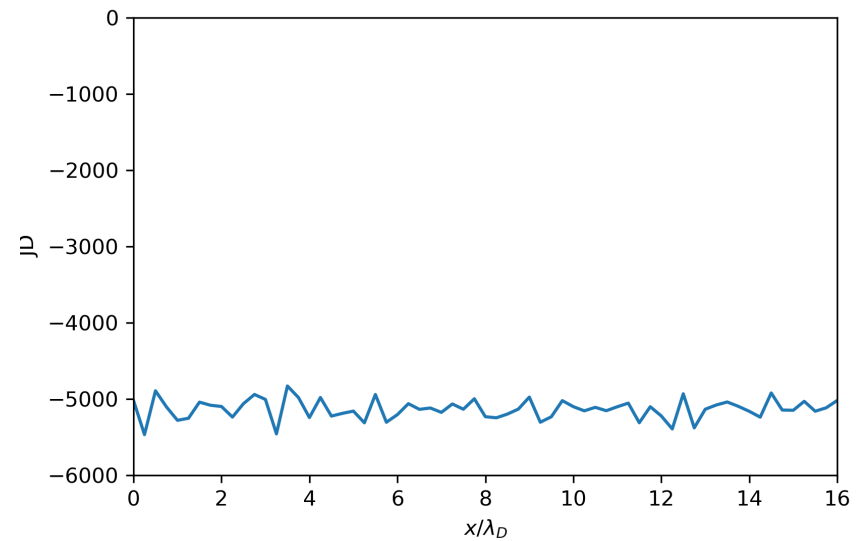
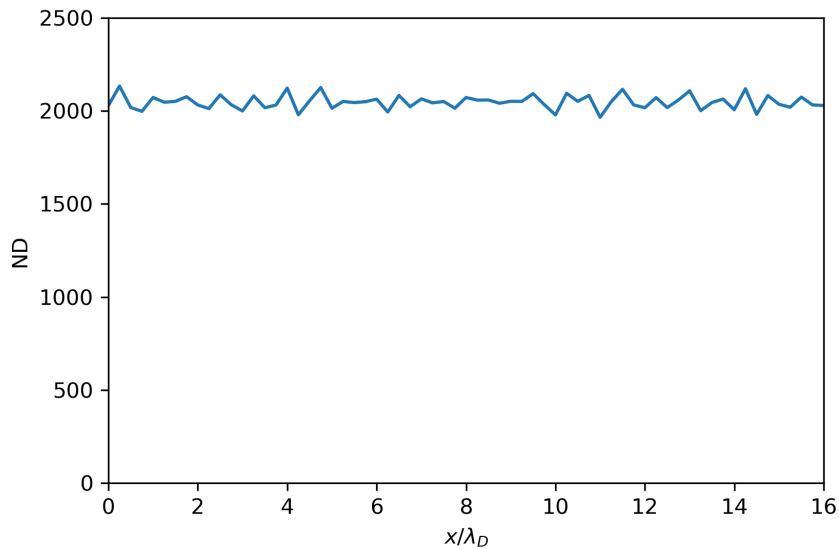
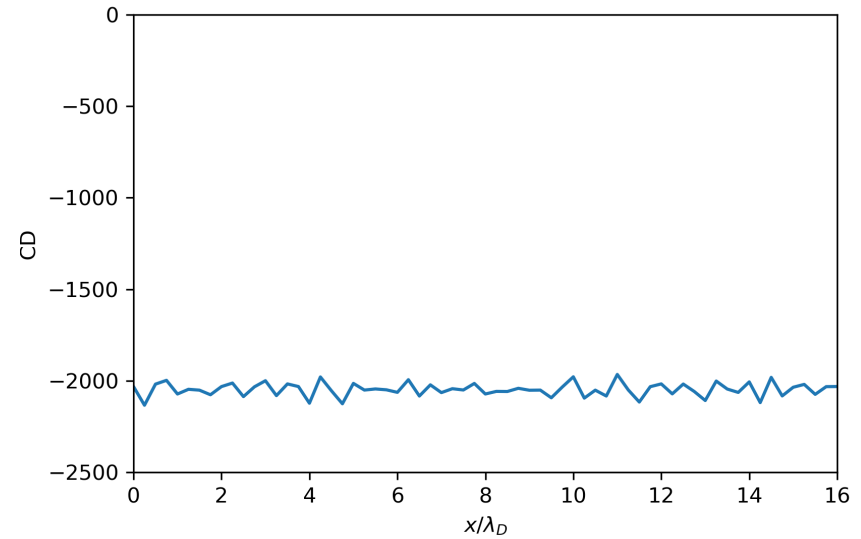
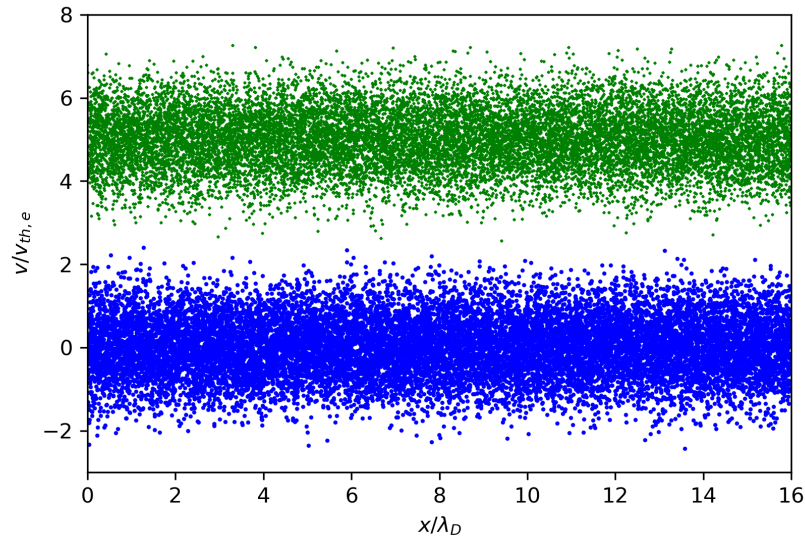
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**For visualization:**

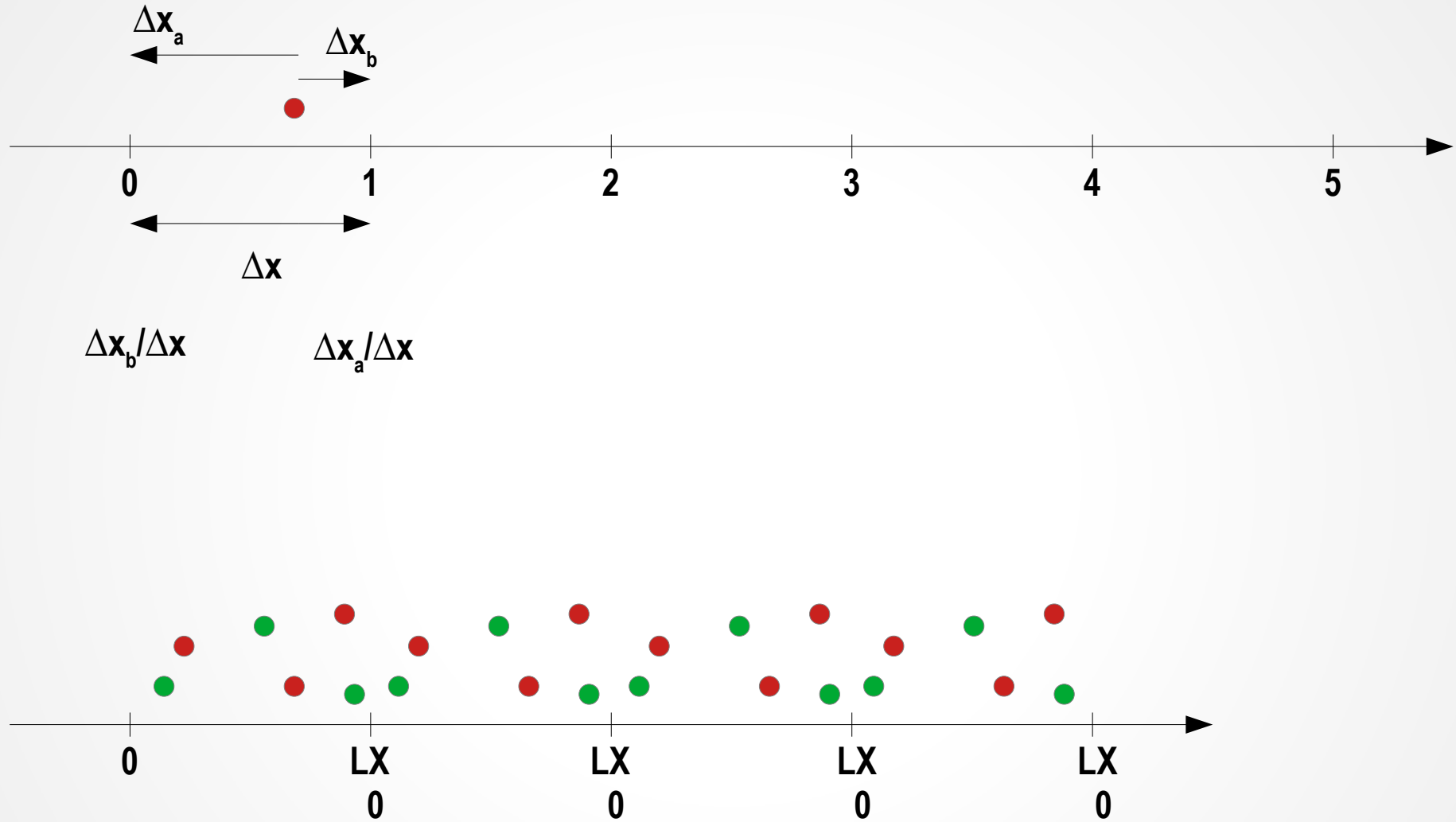
1. Make a x-v phase diagram, just put the particle spots on the plot based on their position and velocity.
2. Make the spatial distribution plot for the total number density, charge density, and current density.



# Particle weighting and normalization: hand-on



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