## Particle－in－Cell（PIC）kinetic simulations 02．Random number generation and its application

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## Random number generator

RAND
Return a real random number within the range $0<=x<1$.

## RANDOM_NUMBER

Return a single random number or an array of random numbers within the range $0<=x<1$.

Example: 02_01_random.f90

## Random number generator



## Area and volume



## Area and volume


$\mathbf{N}_{\text {total }}$ : the total number of spots randomly distributed within the $2 r \times 2 r$ square
$\mathbf{N}_{\text {circle }}$ : the total number of spots luckily located in the circle with the radius r.

While $\mathbf{N}_{\text {total }} \rightarrow \infty$,

$$
\mathrm{N}_{\text {circle }} / \mathrm{N}_{\text {total }} \rightarrow \text { ? }
$$

## Area and volume


$\mathbf{N}_{\text {total }}$ : the total number of spots randomly distributed within the $2 r \times 2 r$ square
$\mathbf{N}_{\text {Iucky }}$ : the total number of spots luckily located in the circle with the radius r.

While $\mathbf{N}_{\text {total }} \rightarrow \infty$,

$$
\begin{aligned}
\mathrm{N}_{\text {lucky }} / \mathrm{N}_{\text {total }} & \rightarrow \pi \mathrm{r}^{2} / 4 r^{2} \\
& =\pi / 4 \\
& =0.785398 \ldots \ldots . . .
\end{aligned}
$$

## Area and volume



If we never know the area of a circle is $\pi r^{2} \ldots$

1. Assume the area of a circle is $\mathbf{A x r x r}$
2. We randomly distribute $\mathbf{N}_{\text {total }}$ spots in the within the $2 r \times 2 r$ square.
3. We calculate the number of spots, $\mathbf{N}_{\text {lucky }}$, which are located in the circle.
4. While $\mathbf{N}_{\text {total }} \rightarrow \infty$, we will find $\mathrm{N}_{\text {lucky }} / \mathrm{N}_{\text {total }} \rightarrow \mathbf{0 . 7 8 5 3 9 8 \ldots}$
5. Then we can conclude the area of a circle is

$$
\begin{aligned}
S & =4 r^{2} \times 0.785398 \\
& =3.141592 \mathrm{r}^{2}
\end{aligned}
$$

## Area and volume



If we never know the area of a circle is $\pi r^{2} \ldots$

1. Assume the area of a circle is Axrx
2. We randomly distribute $\mathbf{N}_{\text {total }}$ spots in the within the $2 r \times 2 r$ square.
3. We calculate the number of spots, $\mathbf{N}_{\text {lucky }}$, which are located in the circle.
4. While $\mathbf{N}_{\text {total }} \rightarrow \infty$, we will find $\mathbf{N}_{\text {lucky }} / \mathrm{N}_{\text {total }} \rightarrow \mathbf{0 . 7 8 5 3 9 8 \ldots}$
5. Then we can conclude the area of a circle is

$$
\begin{aligned}
S & =4 r^{2} \times 0.785398 \\
& =3.141592 \mathrm{r}^{2}
\end{aligned}
$$

Example: 02_02_circle.f90

## Area and volume



The volume of a sphere
The volume of a cone

$$
\mathrm{V}=\mathrm{Ar} \mathrm{r}^{3} ? ?
$$

$$
A=? ?
$$

$$
\begin{gathered}
V=A r^{2} h \\
A=? ?
\end{gathered}
$$

## Spatial distribution

## An uniform-uniform spatial distribution



## A random-uniform spatial distribution



## Spatial distribution

## An uniform-uniform spatial distribution



$$
\mathrm{Px}_{\mathrm{i}}=\Delta \mathrm{xxI} \quad \Delta \mathrm{x}=\mathrm{L} / \mathrm{NP}
$$

A random-uniform spatial distribution


$$
\mathrm{Px}_{\mathrm{i}}=\text { RANDOM_NUMBER } \mathrm{x}_{\mathrm{i}} \mathrm{~L}
$$

L: Length of the system
NP: number of particles

## Spaticl distribution



If you do the math, you can still get...


1. For each particle, we pick a random number as the location of the particle.
2. Based on the location of the particle, read the flag-number from the density distribution function.
3. Pick another random number as a lottery.
4. For the particles that with the lottery-number smaller than the flag-number, we keep them. And we give up the other particles that with the lotterynumber larger than the flag-number.

## Spatial distribution



For each particle, we

1. Pick a random number as the location of the particle.
2. Based on the location of the particle, read the flag-number from the density distribution function.
3. Pick another random number as a lottery, if the lottery-number is smaller than the flag-number. We set down the particle. If not, we go back to step 1 and pick a new location for the same particle.

## Easier to control

the total number of particles



We adjust the density distribution function first.

## For each particle, we

1. Pick a random number as the location of the particle.
2. Based on the location of the particle, read the flag-number from the density distribution function.
3. Pick another random number as a lottery, if the lottery-number is smaller than the flag-number. We set down the particle. If not, we go back to step 1 and pick a new location for the same particle.

## More efficient!!

Example: 02_03_spatialdis.f90

## Spaticl distribution




## Example: 02_04_spatialdis_n.f90

## Spatial distribution




## Example: 02_04_spatialdis_n.f90

Later we will come back to talk about
"Particle weighting
and normalization"


## Velocity distribution



Any idea?

## Velocity distribution




Any idea?
How large of the velocity range we should set?

## Velocity distribution




## Any idea?

## Or any kind of velocity distribution functions?

## Sums of independent random variables



## Sums of independent random variables




## Sums of independent random variables



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## Sums of independent random variables








## Sums of independent random variables



Sums of the random number $[-0.5,0.5]$

## Sums of independent random variables



For each particle, we

1. Pick six random numbers and adjust the the range as $[-0.5,0.5]$
2. Sum the six picked numbers as the particle velocity.
3. The central velocity and thermal velocity can be also defined with the varied range of random numbers.


Example: 02_05_sum6rand.f90

## Random number generator: hand-on

1. Based on the assumption that the volume of a sphere is $\mathrm{V}=\mathrm{Ar}{ }^{3}$, and use the random number generator to find that $A=\pi{ }^{*}(4 / 3)$.
2. Setup $1,000,000$ particles in the spatial space $X=0-10$ with the uniform distribution.
3. Setup $1,000,000$ particles with the velocity distribution $F(v)=\exp \left(-v^{2}\right)$
4. Setup $1,000,000$ particles with the velocity distribution $\left.F(v)=\exp \left(-v^{2} / 4\right)\right)$
5. Setup $1,000,000$ particles with the velocity distribution $F(v)=\exp \left(-(v-3)^{2}\right)$

## Random number generator: hand-on (advanced)

1. Based on the assumption that the volume of a cone is $\mathrm{V}=\mathrm{A} \mathrm{hr}^{2}$, use the random number generator to find that $A=\pi / 3$.
2. Setup $1,000,000$ particles in the spatial space $X=0-10$ with the uniform distribution. And, in these particles, setup 100,000 particles with the velocity distribution $\left.F(v)=\exp \left(-\mathrm{v}^{2} / 9\right)\right)$ and 900,000 particles with the velocity distribution $F(v)=\exp \left(-(v-1)^{2}\right)$.

