

Computational statistical physics: The example of hard spheres

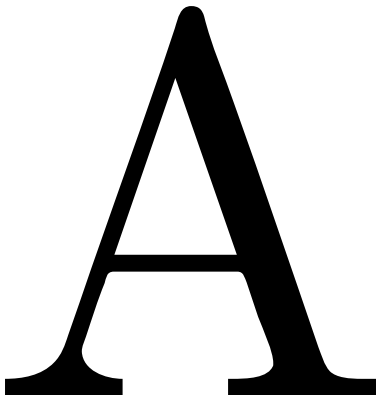
Lectures at the 16th Chris Engelbrecht Summer School in
Theoretical Physics,
Drakensberg, KwaZulu-Natal, South Africa
Fifth part: The A and Ω of Monte Carlo Algorithms

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28 January 2005



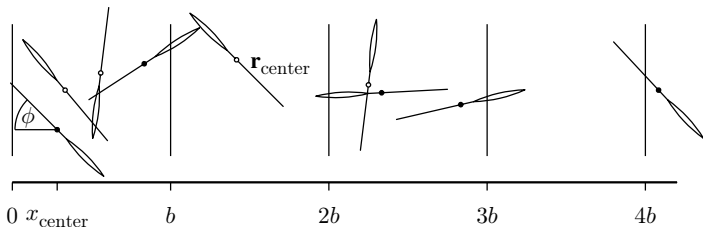


Buffon's needle problem (1777)

- Georges Louis Leclerc, Comte de Buffon (1707-1788)



Coordinates in Buffon's problem



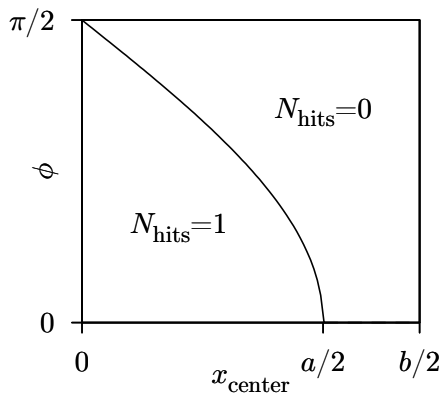
- use 'reduced pad'

$$0 < \phi < \frac{\pi}{2}$$

$$0 < x_{\text{center}} < \frac{b}{2}.$$



'Landing pad' in Buffon's problem



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procedure direct-needle
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```
 $N_{\text{hits}} \leftarrow 0$ 
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```
for  $i = 1, \dots, N$  do
```

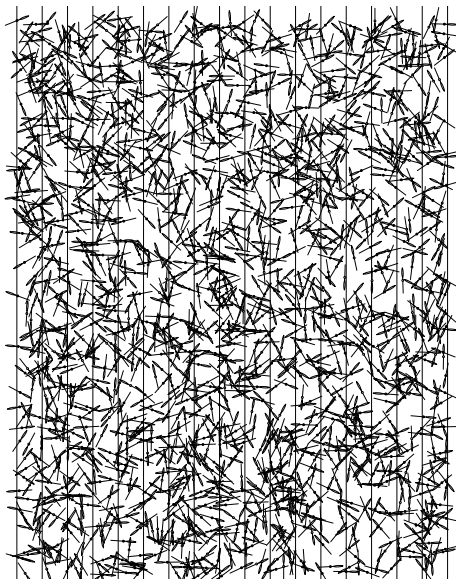
```
     $\left\{ \begin{array}{l} x_{\text{center}} \leftarrow \text{ran}[0, \frac{b}{2}] \\ \phi \leftarrow \text{ran}[0, \frac{\pi}{2}] \\ x_{\text{tip}} \leftarrow x_{\text{center}} - \frac{a}{2} \cos \phi \\ \text{if } (x_{\text{tip}} < 0) N_{\text{hits}} \leftarrow N_{\text{hits}} + 1 \end{array} \right.$ 
```

```
output  $N_{\text{hits}}$ 
```

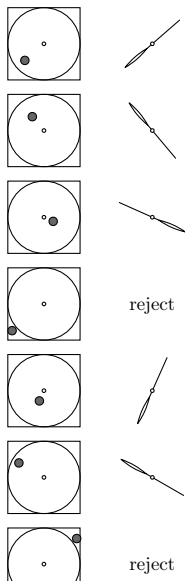
- computes π .
- has a conceptual problem.



Buffon's problem (simulation)



pebble-needle trick



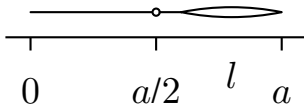

```

procedure direct-needle[patch]
   $x_{\text{center}} \leftarrow \text{ran}[0, b/2]$ 
1   $\delta x \leftarrow \text{ran}[0, 1]$ 
    $\delta y \leftarrow \text{ran}[0, 1]$ 
    $|\mathbf{x}| \leftarrow \sqrt{\delta x^2 + \delta y^2}$ 
   if ( $|\mathbf{x}| > 1$ ) goto 1
    $x_{\text{tip}} \leftarrow x_{\text{center}} - \frac{1}{2}a \cdot \delta x / |\mathbf{x}|$ 
    $N_{\text{hits}} \leftarrow 0$ 
   if ( $x_{\text{tip}} < 0$ )  $N_{\text{hits}} \leftarrow 1$ 
   output  $N_{\text{hits}}$ 

```

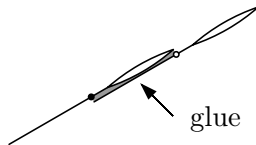


- Interior coordinate of a needle



$\left\{ \begin{array}{l} \text{Are the needles more likely} \\ \text{to hit a crack} \\ \text{at their tip, center, or ear?} \end{array} \right\} \left\{ \begin{array}{l} \text{tip} \\ \text{center} \\ \text{ear} \end{array} \right\} \text{ (circle one).}$

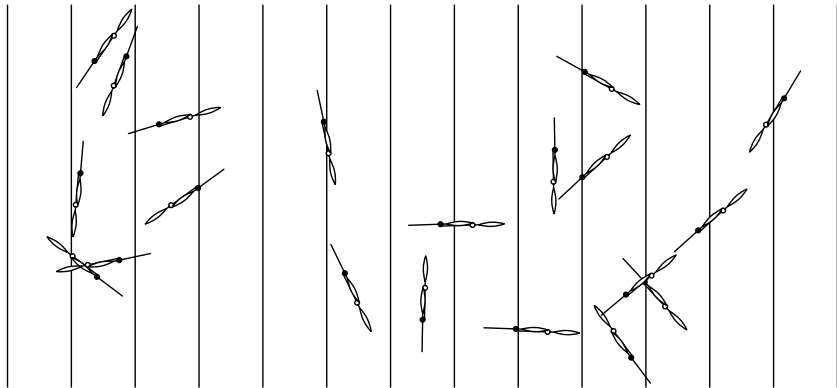




- made up of a black-centered and a white-centered needle



Buffon's experiment with Gadget N° 1

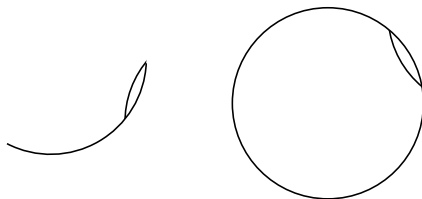


Conclusions (1)

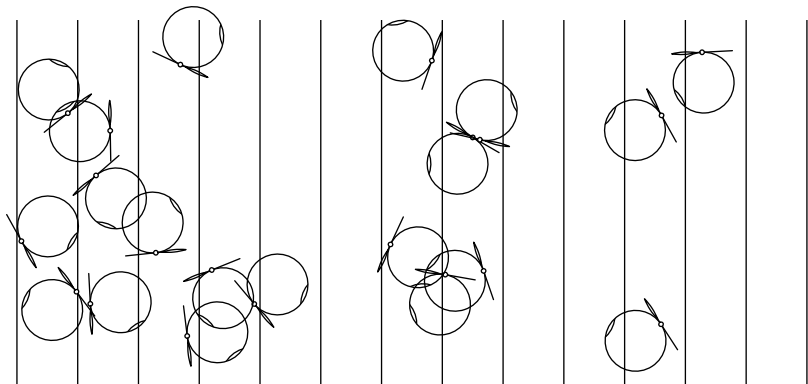
$$\left\{ \begin{array}{c} \text{mean number} \\ \text{of hits} \end{array} \right\} = \gamma \cdot \{ \text{length of needle} \}$$



Cobbler's needles and crazy cobbler's needles



Buffon's experiment with Gadget N° 2



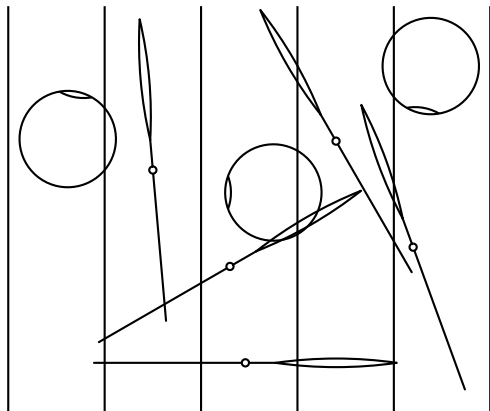
Conclusions (2)

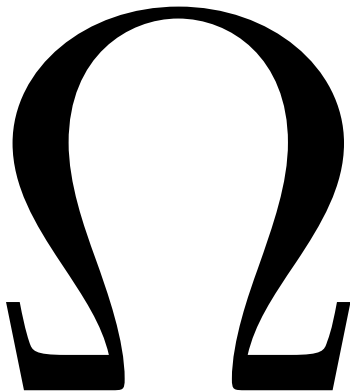
$$\left\{ \begin{array}{c} \text{mean number} \\ \text{of hits} \end{array} \right\} = \gamma \cdot \left\{ \begin{array}{c} \text{length of needle} \\ \text{of any shape} \end{array} \right\}$$

- We need to compute γ

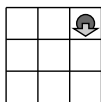


Straight and round needles

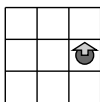




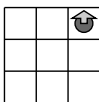
Discrete pebble game



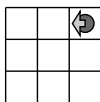
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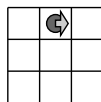
$i = -16$



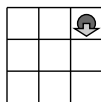
$i = -15$



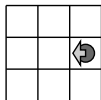
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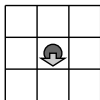
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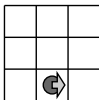
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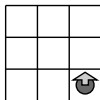
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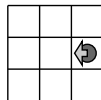
$i = -10$



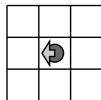
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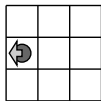
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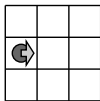
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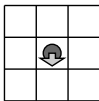
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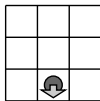
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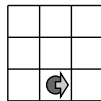
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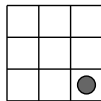
$i = -3$



$i = -2$

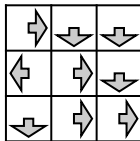


$i = -1$

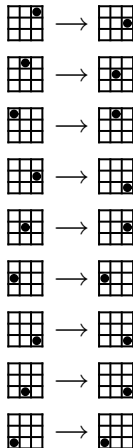


$i = 0$ (now)

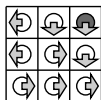




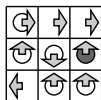
i



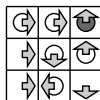
Perfect sampling



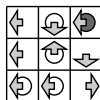
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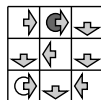
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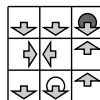
$i = -15$



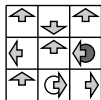
$i = -14$



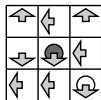
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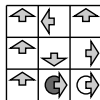
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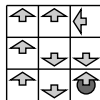
$i = -11$



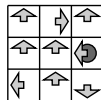
$i = -10$



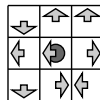
$i = -9$



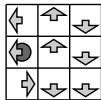
$i = -8$



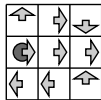
$i = -7$



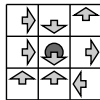
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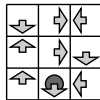
$i = -5$



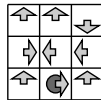
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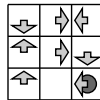
$i = -3$



$i = -2$



$i = -1$

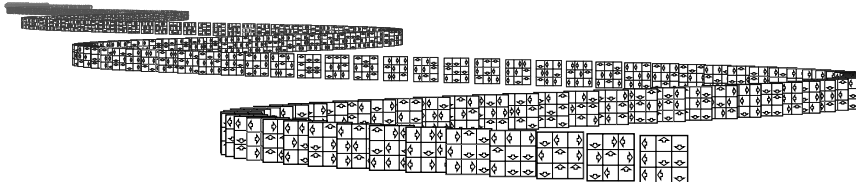


$i = 0$ (now)



scenic view of a simulation with random maps

$$i = -\infty$$



$$i = 0 \text{ (now)}$$

