Continuous probabilities, random points, Bernoulli's theorems, and geometric probability applications

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Introduction	Rules to compute probabilities
Pacheco d'Amorim Foundations of Probability	First geometrical probability problems
Pacheco d'Amorim's Random Figures	Random throws and Bernoulli's theorems
Final Remarks	Bertrand's Paradox (1888)

Rules to compute probabilities

• Discrete case – classical probability definition – the probability that an element **X** randomly chosen from a finite set Ω belongs to the subset $\mathbf{A} \subseteq \Omega$ is given by

$$\mathbb{P}(\mathbf{X} \in \mathbf{A} | \mathbf{X} \in \Omega) = \frac{\#\mathbf{A}}{\#\Omega}, \ \mathbf{A} \subset \Omega, \ \#\Omega < \infty.$$

• Continuous case – geometrical probability definition – the probability that a point **X** randomly chosen in a region Ω lies in a subregion $\mathbf{B} \subseteq \Omega$ is given by

$$\mathbb{P}(\mathbf{X} \in \mathbf{B} | \mathbf{X} \in \Omega) = \frac{\mu(\mathbf{B})}{\mu(\Omega)}, \quad \mathbf{B} \subseteq \Omega, \quad \mu(\Omega) < \infty,$$

where μ denotes some measure of the given regions (area, volume, ...)

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- Nevertheless, in the use of these definitions it is assumed
 - $\mu(\Omega) < \infty \ (\#\Omega < \infty)$ a finite measure of the universe; and
 - Equipossibility/Equiprobability (i.e., equal probability of the basic events).
 - Symmetry;
 - **Principle of insufficient reason of Bernoulli and Laplace** if we have no reason to believe that one way will occur preferentially compared to another, then the events will occur equally likely.

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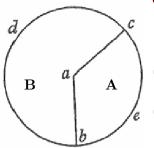
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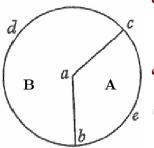
- A ball of negligible size falls perpendicularly upon the centre of a horizontal circle divided into two unequal sectors A and B. Suppose that the ratio of areas of these sectors is 2 to √5.
- And if the ball falls in the sector **A** the player wins *a*, and if it falls into sector **B** wins *b*.
- Newton claims that the "hopes" of the player worth

$$\frac{2a+b\sqrt{5}}{2+\sqrt{5}}.$$

• Newton shows that a chance of a simple event can be irrational, and

• discover the basic rule for the geometric probability definition (chance is proportional to the area).

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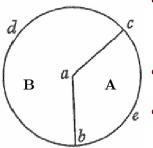


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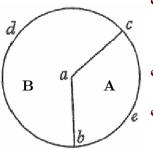
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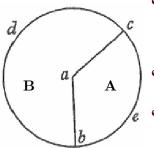


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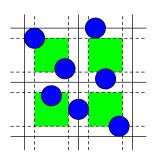
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First problem — Le jeu du Franc-carreau

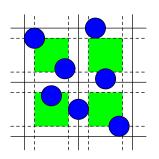


- A round coin is tossed at random on a large plane area covered by regular tiles (squares in 1733; triangles, rhombi and hexagons in 1777) and one of the players bets that the coin hits only one tile (while the other bets that it hits more of them).
- Buffon solves the problem noting that it is sufficient to use the place where the center of the coin drops on the pavement.
- And the geometric probability definition (ratio of areas) is applied.

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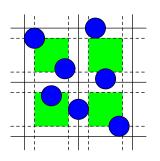


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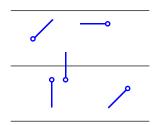
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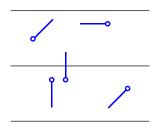
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- In a room, the floor of which is simply divided by parallel joints, a needle is thrown in the air, and one of the players bets that the needle will not cross any of the lines, while the other bets that it will cross.
- Using integral calculus, Buffon obtained

 P = ^{2ℓ}/_{πd}, where ℓ is the needle length and d the distance between the parallels (for d > ℓ).
- Buffon didn't solve the case d ≤ l, only provided (an erroneous) solution (which Laplace corrects in 1812).
- This was the problem that disseminated the geometric probability definition.

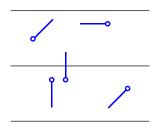
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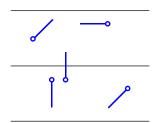
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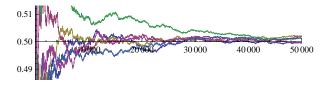
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Jacob Bernoulli (1655–1705) 1713 – Ars conjectandi

• First theorem of stochastic convergence (Weak Law of Large Numbers)

 $\forall \varepsilon > 0 : \lim_{n \to \infty} \mathbb{P}\left[|\hat{p} - p| < \varepsilon \right] = 1.$



 \rightarrow Connecting link between the probability theory and reality (freedom from their dependence on gambling).

MATHEMATICI CELEBERAIMI, ARS CONIEC'I'ANDI.

TRACTATUS DE SERIEBUS INFINITIS, EEUTOLAGABICÉTICA DE LUDO PILÆ REFICULARIS

BASILEE,

Impenfis THURNISIORUM, Fratrum.

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• Thus, in *n* random throws in a region Ω , we have

$$\lim_{n \to \infty} \frac{\mathbf{B}_{hits}}{n} = \mathbb{P}(\mathbf{X} \in \mathbf{B} | \mathbf{X} \in \Omega) = \frac{\mu(\mathbf{B})}{\mu(\Omega)},$$

where \mathbf{B}_{hits} denotes the number of hits on region \mathbf{B} .

• Therefore, carrying out (simulating) the problem of Buffon, we get

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allowing calculate experimentally the value of π .

1850 Rudolf Wolf performed 5000 throws.

- 1855 Augustus de Morgan refers that Ambrose Smith performed 3204 throws;
- 1864 Asaph Hall refers that O. C. Fox performed several sequences with more than 500 throws;
- 1901 Lazzarini performed 3408 throws ($\pi \approx \frac{355}{113} \approx 3.1415929$).

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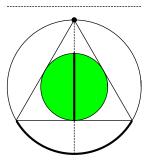
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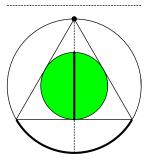
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- S1 If he suppose one fix endpoint of the chord and choose the other, at random, in the circumference → P₁ = ¹/₃;
- S2 If he suppose a fix direction and chose, at random, one point in the diameter which is perpendicular $\rightarrow \mathbb{P}_2 = \frac{1}{2}$;
- **S3** If he chose, at random, one point in the circle and consider the chord that have this point as middle point $\rightarrow \mathbb{P}_3 = \frac{1}{4}$.

There is an one to one relation between the chosen point and the chord.

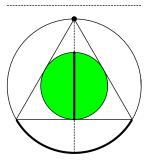
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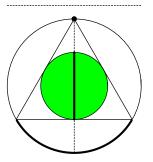


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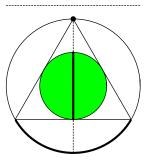
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Contextualization Elements of Probability Calculus Standard model

Probability circa 1914

- The application of the **principle of insufficient reason** gave rise to several paradoxes (such as the Bertrand's paradox).
- The basic concepts of Probability Theory are not clear
 - random choice is a vague concept, having no clear meaning by itself.
- Hilbert (1900) proposed 23 open problems to guide the mathematical investigation during XX century.
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Diogo Pacheco d'Amorim (1888–1976)

PACHECO D'AMORIM, D. (1914). Elements of Probability Calculus, Ph.D. Thesis, Coimbra University.

English translation available on http://www.estg.ipleiria.pt/~rui.santos, done by S. Mendonça, D. Pestana and R. Santos.



ELEMENTS

OF

PROBABILITY CALCULUS

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DIOGO PACHECO D'AMORIM



COIMBRA Imprensa da Universidade 1914

Elements of Probability Calculus

There are N + 1 urns, one of them with N black halls, another one with 1 white and N - 1 black halls, another one with 2 white and N - 2 black halls, etc., nutil the last urn, containing N white halls.

Performing m+n entractions of one half from a randomly chosen um (abrays returning the entracted half to the sum before proceeding to the next entraction), while half is observed in m occasions, and black half in a considers. What is the probability of extracting white half in the (m+n+1)th entraction?

The solution is given in the corollary above, where we may use

$$p_s = \frac{k}{N}$$
 and $q_s = \frac{N-k}{N}$,

obtaining

$$P = \frac{\sum_{k=0}^{N} \left(\frac{k}{N}\right)^{n-k} \left(\frac{N-k}{N}\right)}{\sum_{k=0}^{N} \left(\frac{k}{N}\right)^{n} \left(\frac{N-k}{N}\right)}$$

which may be approximated by



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Standard model

Selecting, at random, one element from the sample space

Pacheco d'Amorim considers that this sentence have a clear meaning if:

- we are the agent of the selection;
- we possess **full information** about the sample space.
- Therefore it can be used as the base to build up Probability Theory.
 - CHAPTER I Discrete case ⇒ random extractions in a finite set ⇒ classical probability definition;
 - CHAPTER II Continuous case ⇒ random throws in a limited region ⇒ geometrical probability definition

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CHAPTER III – Random figures

Goal: To end up with the paradoxes in geometric probability problems by the definition of random choice of each geometrical figure.

• Def. 1 – The random choice of an orientation in \mathbb{R}^n is, by definition, the same as randomly throwing a point (x_1, \ldots, x_n) in the set defined by the equation

$$(x_1 - x'_1)^2 + (x_2 - x'_2)^2 + \dots + (x_n - x'_n)^2 = 1.$$

• **Def.** 2 – Randomly throwing a smaller segment on a bigger one is the same as randomly throwing any given point of the smaller segment on the segment it defines when the smaller segment slides over the bigger one.

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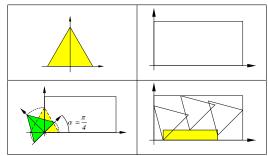
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• **Def.** 3 – To throw a straight line at random in a given region A means, by definition, to throw a point, at random, in A, and to select at random one direction in the region A, which determine the straight line.

• Def. 6 – To throw, at random, a plane region in another plane region \cdots



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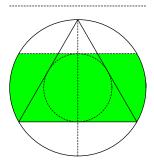
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Bertrand's Paradox

- To chose at random one chord in a circle is (by Pacheco d'Amorim's definitions)
 - to throw a point, at random, in the circle,
 - 0 to select, at random, one direction.
- The probability is independent of the chord direction (let's assume horizontal);
- The probability will be equal to



 $\mathbb{P} \approx 0.609.$

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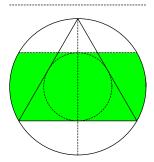
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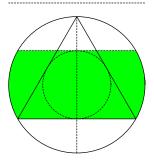




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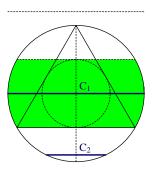
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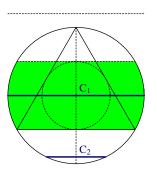
- In Pacheco d'Amorim resolution the possibility of each chord is proportional to its length!
- In fact, all the points that lie in a given chord with the given direction will correspond to the **same** randomly thrown straight line in Pacheco d'Amorim's definition.
- Therefore, we can not consider that the chords are chosen at random (Pacheco d'Amorim has not reached its goal of solving the paradoxes of geometric probability).

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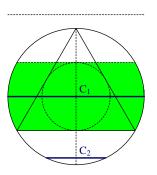
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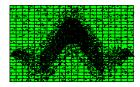


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• If the support is known, but not the probability law

• *Estimate* the probability law.

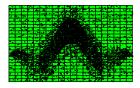


- Sub-divided the region $\mathbf{A} = \bigcup_{i=1}^{n} \mathbf{A}_{i}, \mathbf{A}_{i} \cap \mathbf{A}_{j} = \emptyset, \forall i \neq j$
- Make a great number of throws in the region, in order to estimate the probability of each region.

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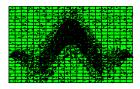


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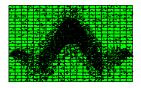


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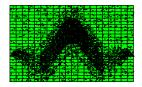


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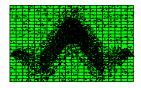


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Is it random?

• And if we are not the agent?

• If the sequence of extractions (throws) are in agreement with Bernoulli's laws, then it can be considered as random.

- $\rightarrow\,$ He analyses if a (long enough) sequence of trials performed by someone else, or even by a mechanical device, can be considered as random.
- $\rightarrow\,$ Thus, it is not required to be a random phenomenon to apply these methodologies (i.e., simulation can be use).

• If it cannot be considered as random then it is out of the scope of Probability Theory Science.

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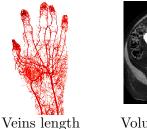
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Some current applications of geometric probability



Islands area







Volume of a tumor

% quartz in sandstone

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Final Comment

- Pacheco d'Amorim (1914) devotes a cumbersome and messy chapter of his doctoral thesis to the explanation of random figures, but in some of his definitions it can not be considered as a random choice.
- Nevertheless, his ideas of probability estimation based on random throws and on the Bernoulli's theorems are in fact the bases of many current applications of geometrical probability.

Thank you for your attention!

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