

# A gentle introduction to combinatorial stochastic processes I

Enrico Scalas

Department of Mathematics, University of Sussex, UK

Stochastic Models for Complex Systems

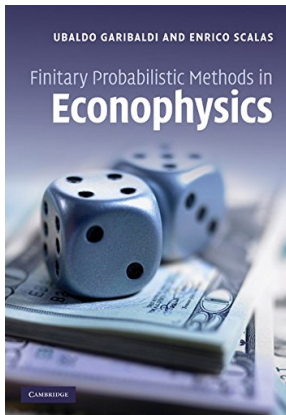
10 June - 7 July, 2021

## Outline

- 1 Basic descriptions
- 2 Examples
- 3 Exercises

# Monograph

Ubaldo Garibaldi and Enrico Scalas, *Finitary Probabilistic Methods in Econophysics*, Cambridge University Press, 2010.



# The genealogy of ideas

Here are some chains of influencers (direct influencers in red):

A Direct path (learning live):

(Hume) → Johnson → (Keynes) → Carnap → Costantini and Garibaldi → Scalas

Two Indirect paths (reading):

Hume → Laplace → Johnson → Carnap → Zabell → Scalas

Ramsey and de Finetti → → Scalas

A *Physical* path:

Boltzmann → → Bach → Costantini and Garibaldi → Scalas

An *Economics* path:

(Keynes) → → Aoki and Yoshikawa → Scalas

The Wittgenstein of *Tractatus* is in the background.

# The problem

We have  $n$  objects divided into  $g$  categories (or classes). How do we describe this state of affairs? The answer is that we can use *individual descriptions*, *statistical descriptions* and *partitions*.

# Facts and propositions

We want to explain how to describe the state of affairs in which for every object listed “alphabetically” or in a sampling order, its category is given. We can consider the descriptions below as *facts* (taking place or not), and the *events* of probability theory as propositions (true or not) about facts (taking place or not).

# Objects and categories I

Let us consider a set of  $n$  elements  $U = \{u_1, u_2, \dots, u_n\}$  representing a finite population of  $n$  physical entities, or physical elements. The symbol  $\#$  is used for the *cardinality* of a set, that is  $\#U = n$  denotes that the set  $U$  contains  $n$  distinct elements. A *sample* of  $U$  is any subset  $S \subseteq U$ , i.e.  $S = \{u_{i_1}, u_{i_2}, \dots, u_{i_m}\}$ . The size of  $S$  is its cardinality, i.e.  $\#S = \#\{u_{i_1}, u_{i_2}, \dots, u_{i_m}\} = m \leq n$ .

# Objects and categories II

It is possible to use quite complicated notations. For the sake of simplicity, let us denote each object with a numerical label from 1 to  $n$  and each category with a numerical label from 1 to  $g$ . We are considering finite (or denumerable) collections of objects and categories, therefore this mapping is always possible.



# Individual descriptions

Let us introduce a set of variables  $X_1, \dots, X_n$ . With the notation  $X_2 = 3$  we mean the fact that the object labeled by 2 belongs to the category labeled by 3. The corresponding proposition is denoted by  $\{X_2 = 3\}$ . If we know to which category each object belongs (i.e. we know the value of  $X_1, \dots, X_n$ ), we have full information on the system of  $n$  objects.

# Statistical descriptions

Let us introduce a set of variables  $Y_1, \dots, Y_g$ . With the notation  $Y_3 = 1$  we mean the fact that the category labeled by 3 contains 1 object. The corresponding proposition is denoted by  $\{Y_3 = 1\}$ . If we know the values of  $Y_1, \dots, Y_g$ , we know how many objects belong to each category, but we do not know exactly which objects belong to which category. We have the constraint

$$\sum_{i=1}^g Y_i = n. \quad (1)$$

# Partitions

Let us introduce a set of variables  $Z_0, \dots, Z_n$ . With the notation  $Z_1 = 2$  we mean the fact that there are 2 categories with 1 object. The corresponding event is denoted by  $\{Z_1 = 2\}$ . If we know the values of  $Z_0, \dots, Z_n$ , we know the number of categories with 0 objects, 1 object, etc., but we lose information on exactly which categories have 0 objects, 1 object, etc.. We have the constraints

$$\sum_{i=0}^n Z_i = g, \quad (2)$$

$$\sum_{i=0}^n iZ_i = \sum_{i=1}^n iZ_i = n. \quad (3)$$

# Number of descriptions

The number of possible individual description is

$$W(\mathbf{X}|n, g) = g^n.$$

The number of possible statistical description is

$$W(\mathbf{Y}|n, g) = \binom{n+g-1}{n} = \binom{n+g-1}{g-1}.$$

There is no closed formula for the number of possible partitions  $W(\mathbf{Z}|n, g)$ .

The number of individual descriptions compatible with a given statistical description  $\mathbf{Y} = (Y_1 = n_1, \dots, Y_g = n_g) = \mathbf{n}$  is

$$W(\mathbf{X}|\mathbf{n}, n, g) = \frac{n!}{n_1! \cdots n_g!}.$$

The number of statistical descriptions compatible with a given partition  $\mathbf{Z} = (Z_0 = z_0, \dots, Z_n = z_n) = \mathbf{z}$  is

$$W(\mathbf{Y}|\mathbf{z}, n, g) = \frac{g!}{z_0! \cdots z_n!}.$$

## Five firms in a small town

Assume we have five firms in a small town belonging to three economic sectors. Let  $X_1 = 1, X_2 = 3, X_3 = 1, X_4 = 2, X_5 = 3$  denote the following state of affairs: firms 1 and 3 belong to sector 1, firms 2 and 5 belong to sector 3 and firm 4 belongs to sector 2. What can we say on statistical descriptions and partitions? It is immediate to see that  $Y_1 = 2, Y_2 = 1, Y_3 = 2$ . As for partitions, one has  $Z_0 = 0, Z_1 = 1, Z_2 = 2, Z_3 = 0, Z_4 = 0, Z_5 = 0$ . One can easily verify that the constraints are satisfied.

## Five particles and three energy levels

Assume that we have five particles that can be in three energy levels. Let  $X_1 = 1, X_2 = 3, X_3 = 1, X_4 = 2, X_5 = 3$  denote the following state of affairs: particles 1 and 3 are in energy level 1, particles 2 and 5 are in energy level 3 and particle 4 in energy level 2. Again one has that that  $Y_1 = 2, Y_2 = 1, Y_3 = 2$ . and  $Z_0 = 0, Z_1 = 1, Z_2 = 2, Z_3 = 0, Z_4 = 0, Z_5 = 0$ .

**We can use this language to describe facts (and propositions) in all disciplines.**

# Samples I

Consider  $n = 4$  agents and  $g = 3$  strategies (e.g. 1:= “bull”, optimistic; 2:=“bear”, pessimistic; 3:=“neutral”, normal), and assume that the individual description is  $\mathbf{X} = (X_1 = 1, X_2 = 2, X_3 = 3, X_4 = 2)$  and the corresponding statistical description is  $\mathbf{Y} = \mathbf{n} = (n_1 = 1, n_2 = 2, n_3 = 1) = (1, 2, 1)$ . Now two agents are drawn without replacement (for a pizza with a friend).

# Samples II

i) List all sample descriptions  $(s_i)_{i=1,\dots,4}$ .

They are:

$$\{(1, 2, 2, 3), (1, 2, 3, 2), (1, 3, 2, 2), (2, 1, 2, 3), (2, 1, 3, 2), \\ (2, 2, 1, 3), (2, 2, 3, 1), (2, 3, 1, 2), (2, 3, 2, 1), (3, 1, 2, 2), \\ (3, 2, 1, 2), (3, 2, 2, 1)\};$$

Their number is  $W(\zeta|\mathbf{n}) = \frac{n!}{n_1!n_2!n_3!} = \frac{4!}{1!2!1!} = 12$ .



## Samples III

ii) *Write all possible descriptions of the reduced sample  $(s_i)_{i=1,2}$ .* If the rule is applied and the first two digits of each permutation are taken, one gets some repetitions:  $\{(1, 2), (1, 2), (1, 3), (2, 1), (2, 1), (2, 2), (2, 2), (2, 3), (2, 3), (3, 1), (3, 2), (3, 2)\}$ , so that the possible description are  $\{(1, 2), (1, 3), (2, 1), (2, 2), (2, 3), (3, 1), (3, 2)\}$ , and this is due to the fact that only “bears” can appear together, as the draw is without replacement. It is useful to note that  $(1, 2), (2, 1), (2, 2), (2, 3), (3, 2)$  can appear twice as the initial part of the complete sequences, while  $(1, 3), (3, 1)$  can appear only once.

# Samples IV

iii) write all possible frequency vectors for the reduced sample and count their number.  $\mathbf{n} = (Y_1 = n_1 = 1, Y_2 = n_2 = 2, Y_3 = n_3 = 1)$  as there are 1 bull, 2 bears and 1 neutral. The possible sample descriptions are (1, 2), (1, 3), (2, 1), (2, 2), (2, 3), (3, 1), and (3, 2).

Here (1, 2), (2, 1) belong to  $\mathbf{m} = (1, 1, 0)$ , and

$$W(\zeta|\mathbf{m}, \mathbf{n}) = \frac{m!}{m_1! \cdots m_g!} \frac{(n-m)!}{(n_1 - m_1)! \cdots (n_g - m_g)!} = \frac{2!}{1!1!0!} \frac{2!}{1!1!1!} = 4; \quad (4)$$

(1, 3), (3, 1) belong to  $\mathbf{m} = (1, 0, 1)$ , and  $W(\zeta|\mathbf{m}, \mathbf{n}) = \frac{2!}{1!0!1!} \frac{2!}{0!2!0!} = 2;$

(2, 2) belongs to  $\mathbf{m} = (0, 2, 0)$ , and  $W(\zeta|\mathbf{m}, \mathbf{n}) = \frac{2!}{0!2!0!} \frac{2!}{1!0!1!} = 2;$

(2, 3), (3, 2) belong to  $\mathbf{m} = (0, 1, 1)$ , and  $W(\zeta|\mathbf{m}, \mathbf{n}) = \frac{2!}{0!1!1!} \frac{2!}{1!1!0!} = 4.$  Note that  $\sum_{\mathbf{m}} W(\zeta|\mathbf{m}, \mathbf{n}) = W(\zeta|\mathbf{n}) = 12$ , where the sum is on the set  $\{\mathbf{m} : m_i \leq n_i, \sum m_i = 2\}.$

## $n$ coins, distributed over $g$ agents

Consider a system of  $n$  coins, distributed over  $g$  agents. Supposing that each coin is labelled, for a given coin, the individual description  $\mathbf{X} = (j_1, j_2, \dots, j_n)$ , with  $j_i \in \{1, \dots, g\}$  tells one to which agent the  $i$ -th coin belongs; the frequency vector of the elements,  $\mathbf{n} = (n_1, \dots, n_g)$ , is the *agent description* and gives the number of coins (the wealth) of each agent; finally, the partition vector  $\mathbf{z} = (z_0, \dots, z_n)$  describes the number of agents with  $0, 1, \dots, n$  coins and is commonly referred to as the *wealth distribution*; however, it is a description (a fact or event) and it should not be confused with a probability distribution.

# Exercise 1

Consider a system of five “energy elements” (whose value is  $\varepsilon$ ) allocated into three molecules.

- 1 Is it consistent to assume that the partition vector is  $(Z_0 = 1, Z_1 = 0, Z_2 = 1, Z_3 = 1, Z_4 = 0, Z_5 = 0)$ ?
- 2 What is its physical meaning?

## Exercise 2

Repeat the analysis of the Example on sampling for  $n = 3$  and  $g = 3$ , the following individual description,  $\mathbf{X} = (1, 2, 3)$  and a sample of 1 element.