

probability theory and random variables

contents

- introduction
- repeatable experiments, sample space, and events
- relative frequencies and basic concepts of probability
- finite sample spaces and events with equal frequencies
- determination of the number of events
- conditional probability
- Bayes theorem
- independent events
- random variables (discrete, continuous)
- concept of expected value

introduction

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- however more general focus is sampling and statistical interpretation
- sample based decisions on population have error rates because each sample differs from each other by chance
- probability deals with uncertainty about random events

repeatable experiments, sample space and events

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- e.g. dice, coin, pill box, cards, automatic bottle filling machine (30 cl), 60 w lamp until it burns out, running a computer program – *process time*)

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- **experiment:** any behaviour or operation about our observations (a much broader definition than scientific terminology)
- e.g. dice, coin, pill box, cards, automatic bottle filling machine (30 cl), 60 w lamp until it burns out, running a computer program – *process time*)
- they are all repeatable + observations vary for each different experiment

repeatable experiments, sample space and events

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- e.g. throwing a six sided die, throwing two coins, drawing 5 pills from a box of 100 pills, drawing 13 cards from a deck of 52 cards, filling a 30 cl bottle by a filling machine with a tolerance of 0.5 cl, time passes until a 60 w lamp burns out, running time of a computer program

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- some experiments have limited number of elements in sample space while some have infinite number of elements

repeatable experiments, sample space and events

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- e.g. how many heads in a two-coins toss
- e.g. how many aces in 13-card draw from a 52-deck

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- events are combinations of elements that we care for in the sample space



repeatable experiments, sample space and events

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- however we can have an **expectation** about the probability that it will happen or not
- this expectation leads to a need for probability theory

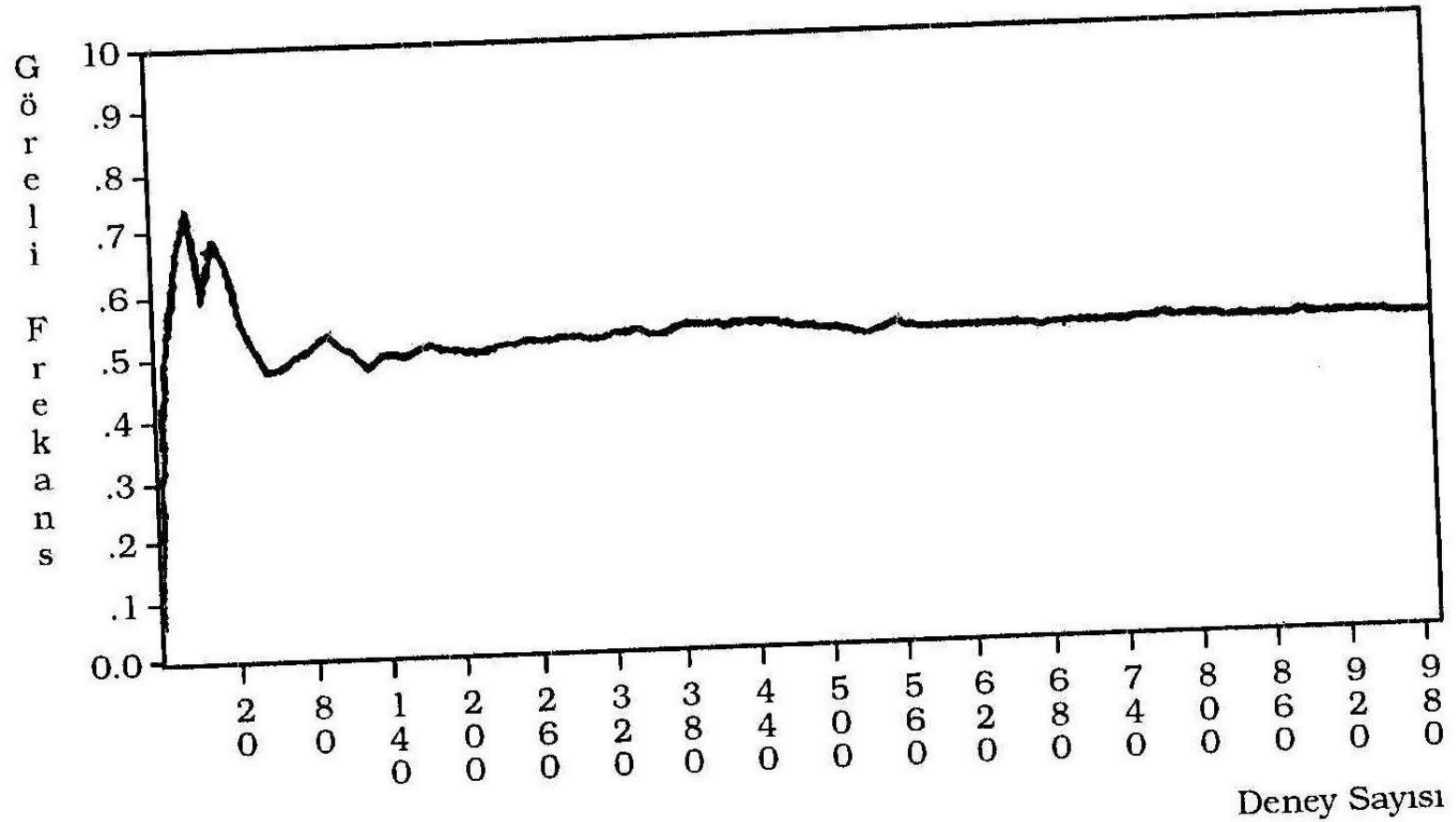


- relative frequency: $\text{event} / \text{all repetition of events}$
- properties of relative frequency



- relative frequency: event / all repetition of events
- properties of relative frequency
- and... **stability**

relative frequencies and probability



Şekil 2.3. Tekrarlanan bir deneyde görelî frekansların değışimi.

relative frequencies and probability

Deney No	1	2	3	4	5	10	20	50	100	200	300	500	1000
Gözlenen Yazı Sayısı	0	1	2	3	3	7	13	24	54	102	158	264	522
Görelî Frekanslar	0	0.50	0.67	0.75	0.60	0.70	0.65	0.48	0.54	0.51	0.53	0.53	0.52



- probability: the probability of an event \rightarrow when trials go to infinity
- properties of probability



- probability: the probability of an event \rightarrow when trials go to infinity
- properties of probability
- properties of $P(A)$

finite sample spaces and events with equal frequencies



- simple events: events consisting only a single element of sample space

finite sample spaces and events with equal frequencies



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- events with equal frequencies (*must be careful! e.g. blood types differ – A, B, AB, O*)



- simple events: events consisting only a single element of sample space
- events with equal frequencies (*must be careful! e.g. blood types differ – A, B, AB, O*)
- 1. *be careful about equality of probabilities*
- 2. *be careful about defining sample space (sometimes you can transform a sample space into an equal probability one -> taking 3 different sized bottles from a bag -> marking!) (and be careful about equality of different combinations of elements in an event)*

determining # of events



- # of elements in an event and total # of events of sample space have to be known to make the calculations, methods are required (e.g. drawing pills)

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- addition method

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- permutation

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- multiplication method
- addition method
- permutation
- combination

determining # of events



- # of elements in an event and total # of events of sample space have to be known to make the calculations, methods are required (e.g. drawing pills)
- multiplication method
- addition method
- permutation
- combination
- mixed

conditional probability



- aspirin & LSD example, with or without putting back

conditional probability



$$S = \left[\begin{array}{l} (1,1), (1,2), (1,3), (1,4), (1,5), (1,6) \\ (2,1), (2,2), (2,3), (2,4), (2,5), (2,6) \\ (3,1), (3,2), (3,3), (3,4), (3,5), (3,6) \\ (4,1), (4,2), (4,3), (4,4), (4,5), (4,6) \\ (5,1), (5,2), (5,3), (5,4), (5,5), (5,6) \\ (6,1), (6,2), (6,3), (6,4), (6,5), (6,6) \end{array} \right]$$

conditional probability

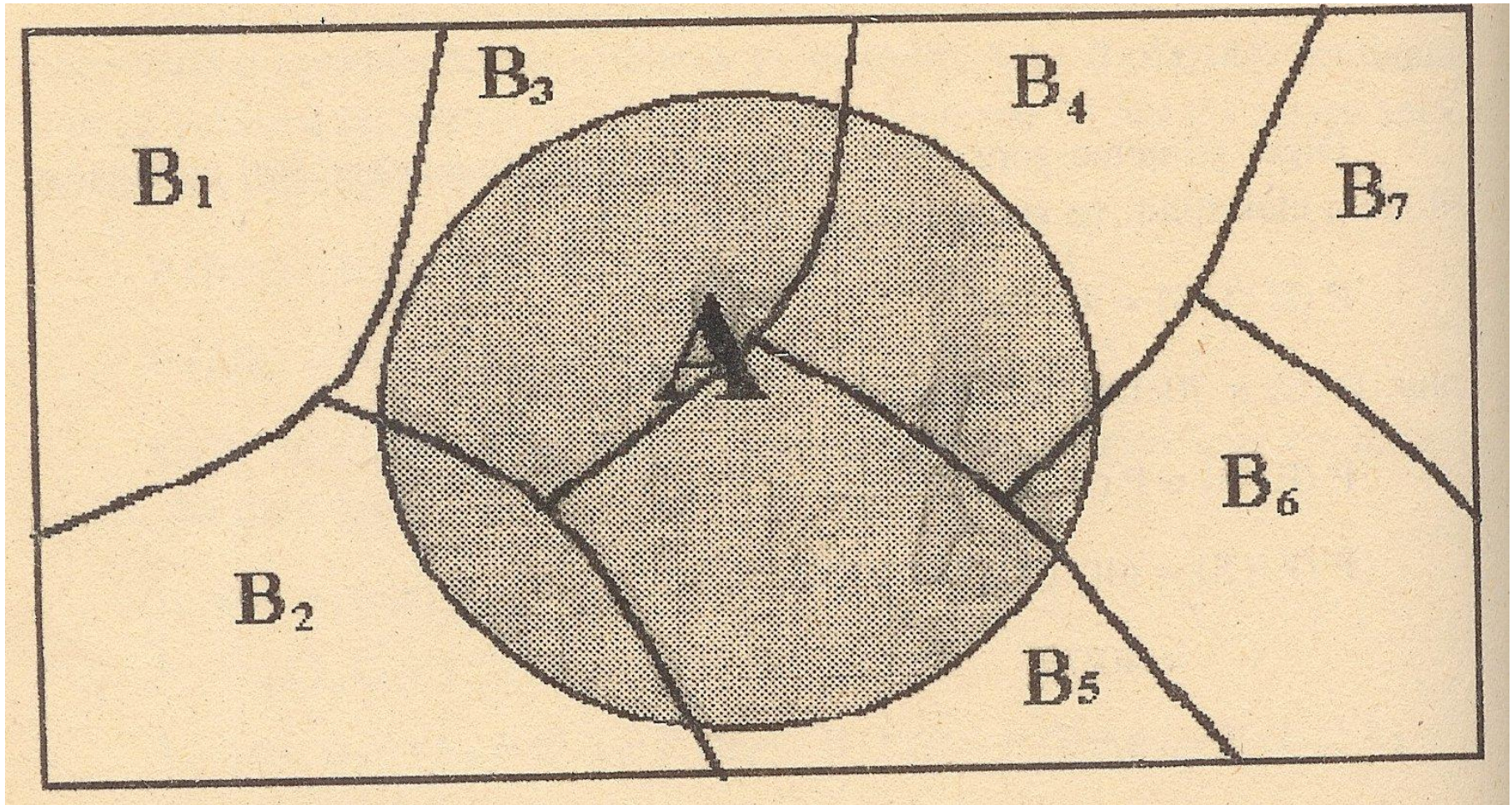


- properties of conditional probability

conditional probability



2.7



Bayes theorem

- return to LSD/aspirin example again:
 - some different queries e.g.
 - *realizing that the pill is defective, what's the probability that it has been produced in first factory?*
 - *realizing that second pill is LSD, what's the probability that first pill was also LSD*

Bayesian Probability

- The term *bayesian* came into use in 1950's
- Contrasts with *frequency probability*



Thomas Bayes
(1702 – 1761)
British Mathematician

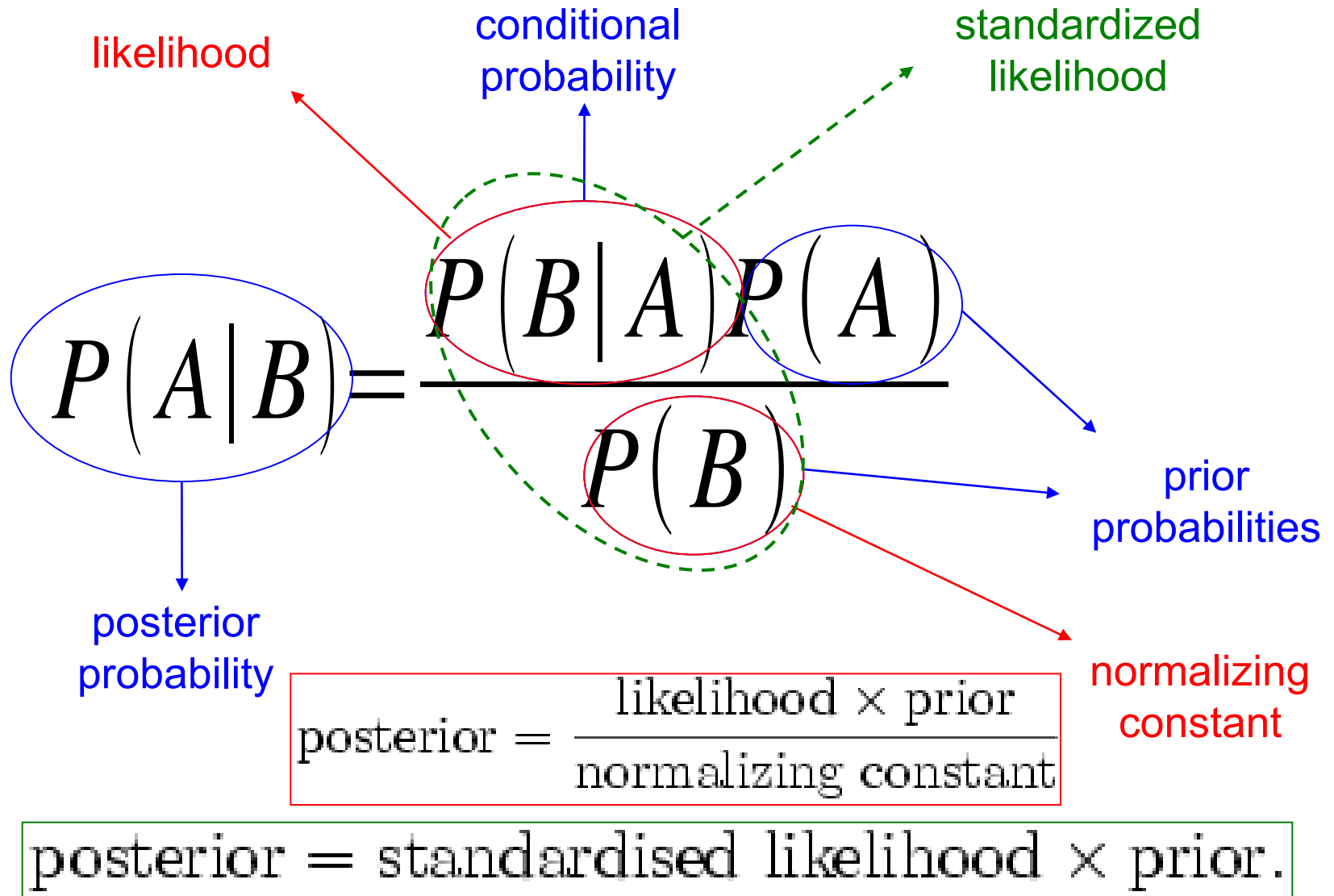
Bayesians v.s. Frequentists

- Frequentists assign probabilities to random events according to their frequencies of occurrence or subsets of populations as proportions of the whole
- Bayesian assign probabilities to propositions that are uncertain

- 1) You have a box of white and black balls, but knowledge as to the quantities 0.5
- 2) You have a box from which you have drawn n balls, half black and half white 0.5
- 3) You have a box and you know that there are same number of white and black balls 0.5

CRITISISM ON EVIDENCE

Bayes' Theorem



Derivation from Conditional Probability

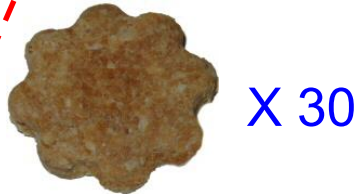
$$\Pr(A|B) = \frac{\Pr(A \cap B)}{\Pr(B)}.$$

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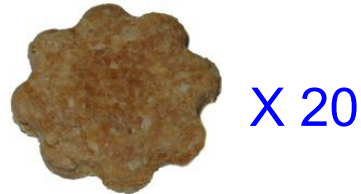
$$\Pr(A|B) \Pr(B) = \Pr(A \cap B) = \Pr(B|A) \Pr(A).$$

$$\Pr(A|B) = \frac{\Pr(B|A) \Pr(A)}{\Pr(B)}.$$

Example (Cookie)



X 30



X 20



X 10

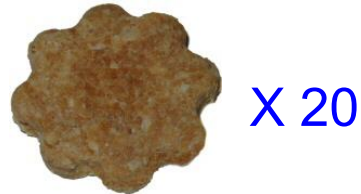
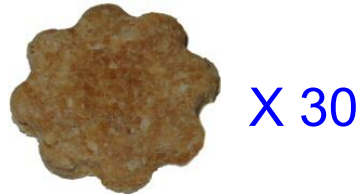


X 20



- Fred picked a plain cookie
- What is the probability that he picked it from bowl 1?

Example (Cookie)



$$\Pr(A|B) = \frac{\Pr(B|A) \Pr(A)}{\Pr(B)} = \frac{0.75 \times 0.5}{0.625} = 0.6$$

Bayesian Inference

“For billions of years, the sun has risen after it has set. The sun has set tonight.

- With very high probability (or I strongly believe that or it is true that) the sun will rise tomorrow.*
- With very low probability (or I do not at all believe that or it is false that) the sun will not rise tomorrow.”*

Very high degree of belief

Very low degree of belief

TRUE

FALSE

independent events

- previous topics covered:
 - $P(B|A)=0$ (mutually exclusive events)
 - $P(B|A)=1$ (event_A is subset of event_B)

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 - $P(B|A)=P(B)$ (*e.g. rolling two dice*)

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- **statistical independence**

random variables

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- observed variables are depicted with X, Y, Z etc... each element of sample space can correspond to only one X value i.e. any random variable can address multiple elements in sample space

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- observed variables are depicted with X, Y, Z etc... each element of sample space can correspond to only one X value i.e. any random variable can adress multiple elements in sample space
- in another words; random variable is a function that mathematically assigns values to elements of sample space

categorization of random variables

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categorization of random variables

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- if the elements of sample space are **countable**, they are called "***discrete random variables***"
- if the elements of sample space are **uncountable**, they are called "***continuous random variables***"

discrete random variables

- if a random variable can have specific number of values (*e.g. # of bacteria in water, # of defectives in tens of samples, # of incoming calls to a call-center in a specific time, # of patients in the doctor's waiting room...*)

discrete random variables



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- properties of the probability distribution of discrete random variables

continuous random variables

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- depends on sensitivity of measurement tool of course (height, weight...)

continuous random variables



- if a random variable can take infinitely many number of values, they are called continuous random variables
- depends on sensitivity of measurement tool of course (height, weight...)
- need to rely on relative frequencies of observations (the higher the # of samples, the more precise the distribution is)

continuous random variables

- how to choose $f(y)$?

continuous random variables

- how to choose $f(y)$?
- how to calculate the area below the curve?
(integrals or readily available tables)

continuous random variables

- how to choose $f(y)$?
- how to calculate the area below the curve? (integrals or readily available tables)
- there are also methods to check whether selected $f(y)$ and real relative frequency curve of population are relevant (covered in further topics)

expected value



- calculating the mean value of a function defined on a theoretic population

references

