

# Basic probability theory

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GE02: day 1 part 1

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# Overview: probability theory definitions

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- Experiment and experimental outcomes
- Events and Probability
- Mutually exclusive events & the rule of summation of probabilities
- Complementary events
- Independent events & the rule of multiplication of probabilities

# Experiment

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Any planned process of data collection

- Tossing a coin
- Measuring height is people
- Genotyping people
- Sampling pedigrees via proband
- ...

# Composition of an experiment

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Consists of a number of independent trials

- Tossing a coin 3 times
- Experiment with 3 trials

Each trial can result in some outcome

- Head or tail
- Trial with 2 outcomes

Many trials – many possible outcomes

- {**TTT**, **TTH**, **THT**, **HTT**, **THH**, **HTH**, **HHT**, **HHH**}
- Experiment with 8 outcomes

# Importance of tossing coins

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- Abstracts an experiment with binary outcome
- Probability theory
  - Binomial, Poisson & Normal distributions
  - Hypothesis testing
- Genetic epidemiology
  - Mendel's laws
  - Hardy-Weinberg equilibrium
  - Genetic drift

# Problem

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- How many outcomes exist for experiment in which  $n$  coin tosses is made?

# Number of experimental outcomes

After 1 trial

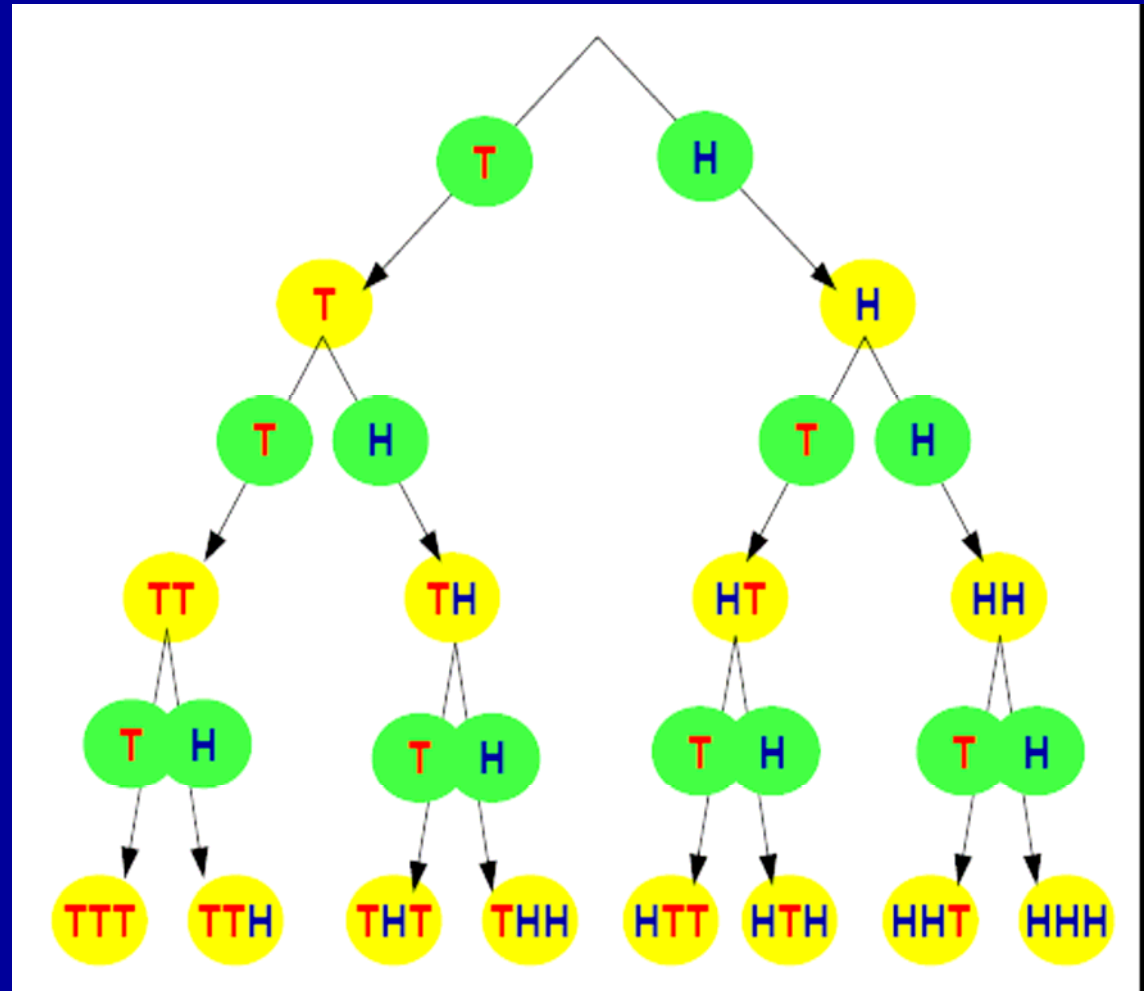
2 outcomes

After 2 trials

$2 \times 2 = 4$  outcomes

After 3 trials

$4 \times 2 = 8$  outcomes



After  $n$  trials:  $2^n$  outcomes

# Event

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Is defined as a single experimental outcome

- All three heads {HHH}
- Two heads and then 1 tail {HHT}

... or a set of outcomes

- A head in 2<sup>nd</sup> trial {THT, HHT, THH, HHH}
- Exactly 1 head {HTT, THT, TTH}
- More than 1 head {HHH, HHT, HTH, THH}



# Probability

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A function of event taking values between 0 and 1

- Frequently denoted as  $P(\text{event})$

Measures how likely is event

- if  $P(A)$  is close to 0 then  $A$  is unlikely
- if  $P(A)$  is close to 1 then  $A$  is very likely

Probabilities of all possible experimental outcomes sum to one

# Probability of heads or tails

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## Tossing a coin once

- Outcome: either head (**H**) or tail (**T**), mutually exclusive
- If coin is fair, both are equally likely
- Therefore  $P(\mathbf{H}) = P(\mathbf{T}) = 0.5$  (or 50%)

## More formal

- Because of symmetry  $P(\mathbf{H}) = P(\mathbf{T})$
- H or T are all possible outcomes  $\Rightarrow P(\mathbf{H}) + P(\mathbf{T}) = 1$
- Thus  $P(\mathbf{H}) = P(\mathbf{T}) = 0.5$

# Probability in $n$ trials

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- $2^n$  outcomes are possible, all are equivalent
- Then probability of a particular outcome is  $1/2^n$
- For example, for 2 trials:
  - $P(\text{HH}) = 1/4$
  - $P(\text{HT}) = 1/4$
  - $P(\text{TH}) = 1/4$
  - $P(\text{TT}) = 1/4$

# Mutually exclusive events

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If the occurrence of one event precludes the occurrence of the other. In three trials

- Events **HHT** and **HTH** are mutually exclusive
- Events “more than 1 head” and “two heads” are not

If events A and B are mutually exclusive, then

- $\Pr(A \text{ or } B) = \Pr(A) + \Pr(B)$

# Example

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What is probability to have event  $A =$  ("one or more heads" in two trials)?

- $P(\mathbf{HH}) = 1/4$
- $P(\mathbf{HT}) = 1/4$
- $P(\mathbf{TH}) = 1/4$
- $P(\mathbf{TT}) = 1/4$

$P(\text{"one or more heads"}) =$

$P(\mathbf{HH} \text{ or } \mathbf{HT} \text{ or } \mathbf{TH}) =$

$P(\mathbf{HH}) + P(\mathbf{HT}) + P(\mathbf{TH}) =$

$1/4 + 1/4 + 1/4 = 3/4$

# Genetic example

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Consider a gene with two alleles

- N (Normal) and
- D (Disease)

Probability of observing a person with genotypes NN, DN and DD in a population are

- $P(NN)=0.81$ ,
- $P(ND)=0.18$  and
- $P(DD)=0.01$

# Problem

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- What is probability that a random person is a carrier of the D allele?
- A **carrier** of an allele is a person having at least one copy of this allele in the genotype

# Solution

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$$= P(\text{carrier}) =$$

$$= P(\text{ND or DD}) =$$

[mutually exclusive =>]

$$= P(\text{ND}) + P(\text{DD}) =$$

$$= 0.18 + 0.01 =$$

$$= 0.19$$



# Complementary event

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Define  $B = \text{"not } A\text{"}$

$B$  is called an "event, complementary to  $A$ "

" $A$  or  $B$ " covers all possible outcomes

- $P(A \text{ or } B) = P(A \text{ or "NOT } A\text{"}) = 1$

$B$  and  $A$  are mutually exclusive

- $P(A \text{ or } B) = P(A) + P(B) = 1$

Therefore  $P(B) = 1 - P(A)$

# Examples

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What is probability to have “one or more heads” in two trials?

$$P(\text{“more than 1 head”}) =$$

[complementary event = “no heads”]

$$1 - P(\text{“no heads”}) = 1 - P(\text{TT}) = 1 - \frac{1}{4} = \frac{3}{4}$$

What is probability that a person is carrier?

[ $P(\text{NN})=0.81$ ,  $P(\text{ND})=0.18$ ,  $P(\text{DD})=0.01$ ]

$$P(\text{“carrier”}) =$$

[complementary event = “not carrier”]

$$1 - P(\text{“not carrier”}) = 1 - P(\text{NN}) = 1 - 0.81 = 0.19$$

# Independent events

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Two events are **independent** if the outcome of one has no effect on the outcome of the second event

- Event “having head in first toss” and “having head in second toss” are independent
- Genotypes of two random people from a population are independent

# Probability: independent events

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- Two events A and B are independent when
  - $\Pr(A \text{ and } B) = \Pr(A) \Pr(B)$
- Sex of next offspring does not depend on the sex of the previous
  - $P(\text{boy}) = P(\text{girl}) = 1/2$

# What is probability of three girls born?

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- $P(\text{"girl" and "girl" and "girl"}) = \frac{1}{2} \frac{1}{2} \frac{1}{2} = \frac{1}{8}$
- The same applies to having Heads three times

# Problem

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- In some elderly population, prevalence of hypertension (HT) is 42% in female and 57% in male. What is the probability that
  - Both spouses are HT?
  - Both spouses are NOT HT?
- Assume independence

# Solution

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- Both spouses are HT

$$P(\text{husband=HT} \ \& \ \text{wife=HT}) =$$

$$P(\text{male=HT}) \ P(\text{female=HT}) = 0.57 \ 0.42 = 0.24$$

- Both spouses are NOT HT

$$P(\text{husband}\neq\text{HT} \ \& \ \text{wife}\neq\text{HT}) =$$

$$P(\text{husband}\neq\text{HT}) \ P(\text{wife}\neq\text{HT}) =$$

$$[1 - P(\text{male=HT})] \ [1 - P(\text{female=HT})] =$$

$$0.43 \ 0.58 = 0.25$$

# Non-independent events

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Risk of disease in women whose partner had a disease compared to those whose partner did not

Disease	Odds Ratio (95% CI)
Hypertension	1.39 (1.14 to 1.70)
Depression	2.18 (1.78 to 2.67)
Asthma	1.68 (1.45 to 1.94)

Shared lifestyle risk factors?

*Hippisley-Cox et al., BMJ 2002;325:636*