Bayesian paradigm

## Bayes theorem: exercise

As of May  $11^{th}$ , about 7% of the French population was estimated to have had COVID-19. A medical test has the following properties:

- if someone has COVID-19, its test will come out positive 71% of the time
- if someone does not have the disease, its test will come out negative 98% of the time

Given that someone got a positive result, what is his/her probability to truly have COVID-19?

$$Pr(M = +) = 0.07$$
  $Pr(T = +|M = +) = 0.71$   $Pr(T = -|M = -) = 0.98$ 

$$Pr(M = +|T = +) = \frac{Pr(T = +|M = +)Pr(M = +)}{Pr(T = +)}$$

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$$= (0.71 \times 0.07)/(0.71 \times 0.07 + (1 - 0.98) \times (1 - 0.07)) = 0.73$$
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## Continuous Bayes' theorem

- parametric (probabilistic) model  $f(y|\theta)$
- parameters  $\theta$
- probability distribution  $\pi$

Continuous Bayes' theorem:

$$p(\theta|y) = \frac{f(y|\theta)\pi(\theta)}{\int f(y|\theta)\pi(\theta) \, \mathrm{d}\theta}$$

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remember Pierre-Simon de Laplace!

Bayesian paradigm

# Bayes philosophy

#### Parameters are random variables ! - no "true" value

- $\Rightarrow$  induces a marginal probability distribution  $\pi(\theta)$  on the parameters: the **prior** distribution
  - e allows to formally take into account hypotheses in the modeling
  - enecessarily introduces **subjectivity** into the analysis

## Bayesian vs. Frequentists: a historical note

- Bayes + Laplace ⇒ development of statistics in the 18-19<sup>th</sup> centuries
- 2 Galton & Pearson, then Fisher & Neymann  $\Rightarrow$  frequentist theory became dominant during the  $20^{th}$  century
- ${f 3}$  turn of the  ${f 21}^{th}$  century: rise of the computer
  - ⇒ Bayes' comeback



### Bayesian vs. Frequentists: an outdated debate

Fisher firmly rejected Bayesian reasoning

⇒ community split in 2 in the 20<sup>th</sup>

### Bayesian vs. Frequentists: an outdated debate

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To be, or not to be, Bayesian, that is no longer the question: it is a matter of wisely using the right tools when necessary

Gilbert Saporta