

# Statistical methods with application to demography and life insurance

(Comments on the book)

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# Overview

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2. Models of distribution function  $F(x)$  and force of mortality  $\mu(x)$
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# 1. Duration of life as a random variable

$T$  - duration of life,  $x$  - age,  $T - x$  - remaining life;  
their distributions, moments, etc.

Duration of life – random?

## 2. Models of $F(x)$ and force of mortality $\mu(x)$

Fitting something to something – is it good?

Much better work starts not with fitting, but with a model: fitting the model is then verification of the assumption.

Classifications according to the behavior of the force of mortality/failure rate.

E.g., lognormal distribution has decreasing failure rate:

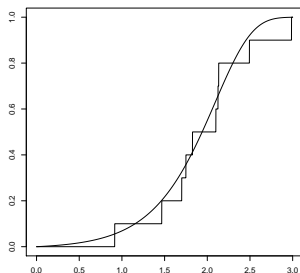
$$\mu(x) \searrow \text{ in } x$$

### 3. The empirical distribution function of duration of life

Empirical distribution function is a most important object in statistics; it is based solely on observations:

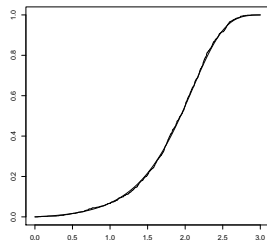
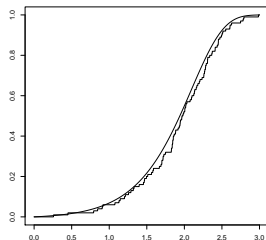
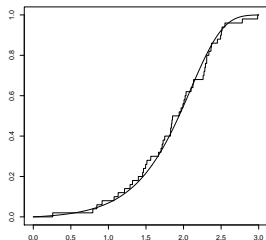
$$\hat{F}_n(x) = \frac{1}{n} \sum_{i=1}^n \mathbb{I}_{\{T_i \leq x\}}$$

But does  $F$  exist?



$n = 10$  observations from Gompertz distribution

## 4. Derivation of $\hat{F}_n(x)$ from $F(x)$ as a random process



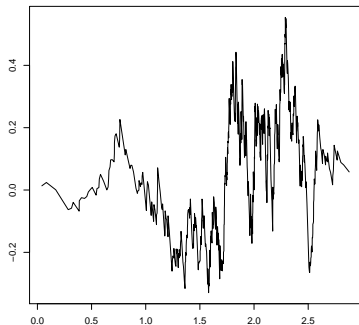
Glivenko – Cantelli Theorem

$$\sup_x |\hat{F}_n(x) - F(x)| \rightarrow 0, \text{ as } n \rightarrow \infty$$



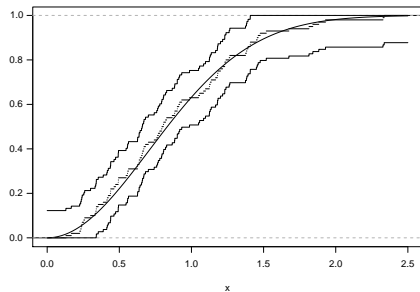
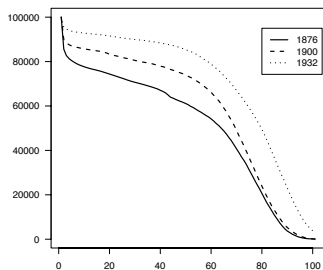
## 5. Limit of empirical process: Brownian Bridge

$$\sqrt{n}[\hat{F}_n(x) - F(x)]$$



Limit distribution of chi-square statistic  $\sum_{j=1}^m \frac{(\nu_{jn} - np_j)^2}{np_j}$  explained

## 6. Statistical consequences of what we have learned so far



## 7. Testing parametric hypotheses. Unexpected example – Roman Emperors

When is it that a model distribution does not depend on a parameter? – never.

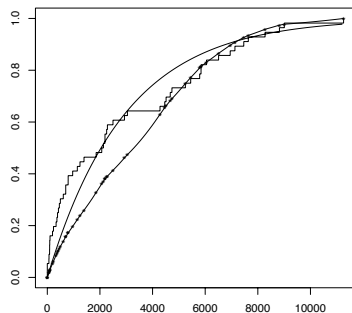
So, there are parameter(s) (say,  $\theta$ ), which need to be estimated (say, by  $\hat{\theta}_n$ ) from the data.

However, behavior of “estimated” empirical process

$$\sqrt{n}[\hat{F}_n(x) - F_{\hat{\theta}_n}(x)]$$

is very different from that of empirical process with  $\theta$  known.

## ... cont. Unexpected example – Roman Emperors



Empirical distribution function and approximating exponential distribution function (+ the compensator)

## 8. Estimation of the rate of mortality

$$\mu(x) = \frac{f(x)}{1 - F(x)}$$

Smoothing methods

$$\hat{f}_n(x) = \int K_{\Delta}(x, y) d\hat{F}_n(y)$$

## 9. Censored Observations. Related point processes

The observations  $T$  we would like to make are screened by “nuisance” censoring variables  $Y$ , so that we can only observe  $\min(T, Y)$ , and we also know whether it was a  $T$  or a  $Y$ .

## 10. Kaplan-Meier Estimator

$$\bar{F}_n(x) = 1 - \prod_{s \leq x} \left[ 1 - \frac{dN(s)}{Y(s-)} \right]$$

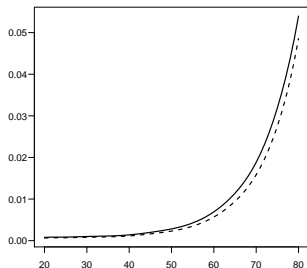
# 11. Statistical Inference about $F$ , based on Kaplan-Meier estimator

Functional CLT (central limit theorem) for martingales.



## 12. Life Insurance and net premiums. Remark on mixtures

whole life insurance; whole life insurance with time-limited premium; term life insurance; insurance with variable sum insured and variable premium; group life insurance.



Australian data: population force of mortality and bruto premium per year (dotted line).

### 13. More on net premiums. Endowments and annuities

Overpayment in the prices of the final moment:  
actuarial value of the insurance policy at the moment  $t = 0$

$$\pi_0 = cEe^{-\rho\tau};$$

at the (random) moment of payment  $\tau$ :

$$\pi_0 e^{\rho\tau}$$

and, consequently, its expected value will be

$$\pi_0 Ee^{\rho\tau} = cEe^{-\rho\tau} Ee^{\rho\tau},$$

which is more than  $c$ !

pure endowment; life annuity; deferred annuity; term annuity;  
term deferred annuity; endowment assurance contracts.

## 14. Annuities certain. Some problems of general theory

If amount  $c$  is payable in  $n$  contracts at random times  $\{\tau_i\}_{i=1}^n$ , then

$$c\widehat{F}_n(t) - \int_0^t p(s)(1 - \widehat{F}_n(s)) ds$$

is nominal accumulated loss. Discounted to the time of inception, its value is

$$c \int_0^t e^{-\rho s} d\widehat{F}_n(s) - \int_0^t e^{-\rho s} p(s)(1 - \widehat{F}_n(s)) ds$$

and at price level of the current time  $t$  it becomes

$$c \int_0^t e^{\rho(t-s)} \left[ d\widehat{F}_n(s) - \frac{p(s)}{c} (1 - \widehat{F}_n(s)) ds \right].$$

## 15. Right tail behavior of $\hat{F}_n$

When studying long lives (or large claims, etc.), we need to consider behavior of  $\hat{F}_n(z)$  for large  $z$ . This behavior, or behavior of the tail

$$1 - \hat{F}_n(z),$$

is very different from the behavior of the “central” part:

$$n(1 - \hat{F}_n(z))$$

forms not Gaussian but Poisson process, driven by the tail distribution function of remaining life  $T - x$ ,

$$P(T - x > z | T > x)$$

...cont. Right tail behavior of  $\hat{F}_n$

$$P(T - x > z | T > x) \rightarrow \begin{cases} (1 + \theta z/\sigma)^{-1/\theta}, & \text{if } \theta \neq 0 \\ e^{-z/\sigma}, & \text{if } \theta = 0 \end{cases}$$

## 16. Population dynamics

A system of populations, first without – then with migrations is studied through the system of stochastic differential equations

$$d\mathbf{P}(t) = \mathbf{C}\mathbf{P}(t)dt + d\mathbf{M}(t),$$

and the system of corresponding martingales (“noise” part)  $\mathbf{M}$  is described.

$$\mathbf{P}(t) = \int_0^t e^{\mathbf{C}(t-s)} d\mathbf{M}(s) + \mathbf{P}(0)e^{\mathbf{C}t}$$

Age structure of a population

$$\frac{P(t, x)}{P(t)}$$

and what is involved in its analysis is presented.

# Publication details

16 Lectures.

About 75 exercises.

Over 100 references.

About 170 terms in the Index.