# A hazards approach to the biometric analysis of infant mortality

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#### Outline

- Jean Bourgeois-Pichat (1951): Biometric analysis of infant mortality (background).
- Hazard-based alternative.
- Theoretical considerations
- Real-world examples.

## Bourgeois-Pichat and causes of death

- Two categories:
  - Endogenous: inherited, delivery, etc.
  - Exogenous: accidental, infectious diseases, etc.
- How to differentiate between the two categories without information of causes of death?

Bourgeois-Pichat's biometric model.

#### The biometric model

#### Two postulates:

- Endogenous deaths only occur during the neonatal period (0-28 days).
- On a specific time scale, exogenous infant mortality is uniformly distributed.
  - The log-cube time scale.

# The log-cube transform

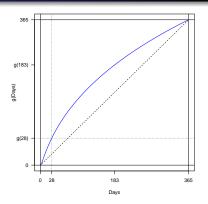
$$g(t) = C \log^3(t+1), \ 0 < t \le 365.$$

where C is a normalizing constant:

$$C = \frac{365}{\log^3(365+1)}$$

t is age in days.

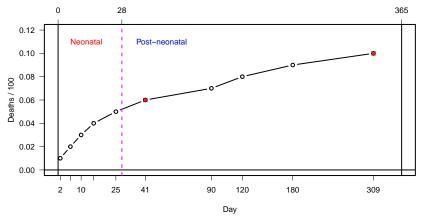
Note: C is not part of B-P's original definition.



## Demonstration of the B-P plot

Assume 100 births, of which 90 survives infancy, ten death ages:

2, 6, 10, 15, 25, 41, 90, 120, 180, 309.

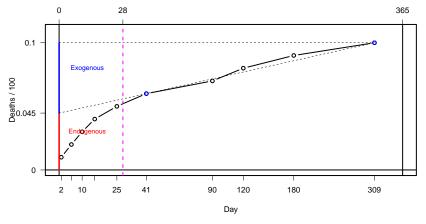


Calculation (no ties):  $\frac{1}{100}, \frac{2}{100}, \frac{3}{100}, \dots, \frac{10}{100}$ .

## Demonstration of the B-P plot II

Assume 100 births, of which 90 survives infancy, ten death ages:

2, 6, 10, 15, 25, 41, 90, 120, 180, 309.

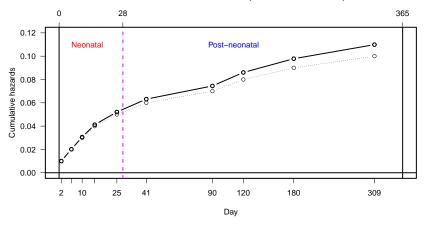


Calculation (no ties):  $\frac{1}{100}, \frac{2}{100}, \frac{3}{100}, \dots, \frac{10}{100}$ .

## The hazards plot

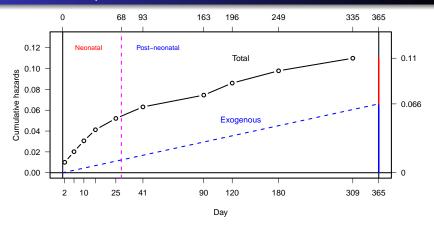
Assume 100 births, of which 90 survives infancy, ten death ages:

2, 6, 10, 15, 25, 41, 90, 120, 180, 309 (same as before).



Calculation (no ties):  $\frac{1}{100}, \frac{2}{99}, \frac{3}{98}, \dots, \frac{10}{91}$ .

## The hazards plot II

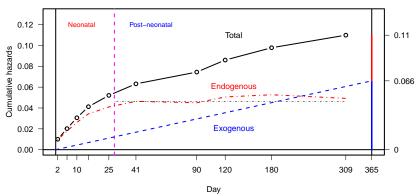


Exogenous slope = 
$$\frac{\#(post deaths)}{post exposure} = \frac{5}{27626} \approx 0.00018$$

Post exposure =  $90(365 - 68) + (93 - 68) + (163 - 68) + \cdots + (335 - 68) \approx 27626$ 

# Adding the endogenous mortality

By subtraction: Endogenous = Total - Exogenous



#### Earlier work

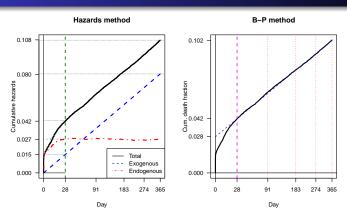
- Knodel & Kintner (1977).
  - Discusses effects of breastfeeding habits.
- Wrigley (1977).
  - Problems with data recording.
- Lynch, Greenhouse & Brändström (1998).
  - Mentions "constant hazard".
  - Suggest linear regression methods.
- Bengtsson (1999).
  - Data quality.
- Manfredini (2004).
  - Deals with effect of climate variation.

# Study areas

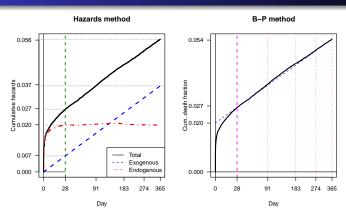




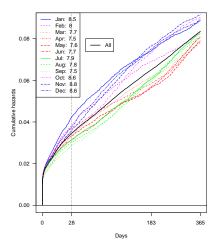
#### Västerbotten 1861-1890



### Västerbotten 1921–1950



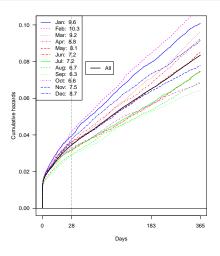
#### Cohort effect of birth month, Västerbotten



#### Conclusion:

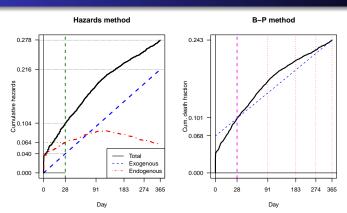
Post-neonatal linearity is a population property, not an individual.

## Period effect of month, Västerbotten

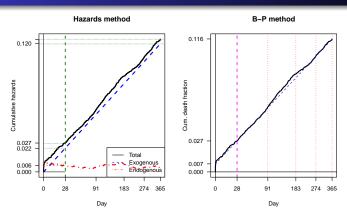


Looks quite proportional!

## Scania 1711-1800



## Skellefteå 1801–1820



## Biometric analysis on the natural time scale

Given that the exogenous mortality follows an Exponential distribution on the log-cube scale, it follows that the cumulative hazards function H on the natural time scale is

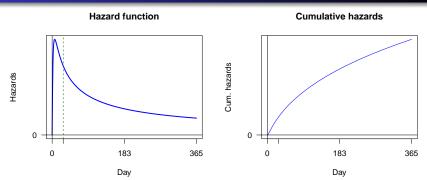
$$H(t;\lambda) = \lambda \log^3(t+1), \ t \ge 0,$$

and it follows that the hazard function h is given by

$$h(t;\lambda)=\lambda\frac{3\log^2(t+1)}{t+1},\ t\geq 0,$$

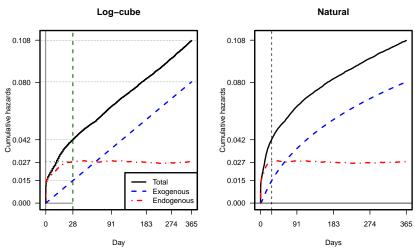
As  $\lambda$  varies, this constitutes a proportional hazards family of distributions.

# Exogenous mortality on the normal time scale

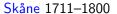


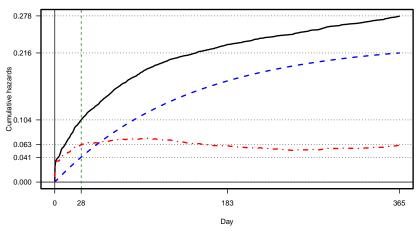
## Natural vs. log-cube time scales

Västerbotten 1861-1890.



# Natural time scale and Gompertz exogenous distribution





#### Conclusions

- Advantages of the hazards method.
  - Fits naturally into modern survival analysis, allows censored and truncated data, and
  - The exogenous component forms a class of proportional hazards distributions.
  - So, theoretically more appropriate.
- Restrictions for both models.
  - Models for populations, not for individuals.
  - Less useful for traditional survival analysis.
  - The log-cube transform is not universal.

## Suggestions for future work

- Work on the natural time scale, if
  - access to a computer, and
  - suitable software.
- Try standard distributions for exogenous mortality, eg.
  - Weibull,
  - Gompertz.
- Remember that we are dealing with competing risks!
  - Requires special care.

https://github.com/goranbrostrom/ESSHC\_23

**R** code for this paper and talk.