

# *Techniques for Modelling the Life-Cycle Cost of Civil Infrastructures*

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# *Introduction*

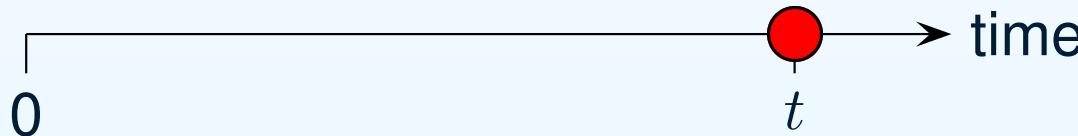
# Introduction

- Netherlands Directorate General for Public Works and Water Management is responsible for management of road bridges
- Management can be optimised by balancing maintenance and replacement of bridges using life-cycle costing:
  - information on time and cost of bridge replacement and maintenance is needed
- Paper has two objectives:
  - determining lifetime distributions for concrete bridges
  - computing the expected cost of replacement and maintenance of the current bridge stock as a function of time and age

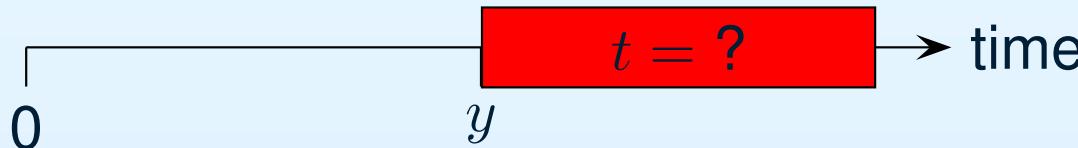
## *Lifetime distribution of bridges*

# Statistical analysis of bridge lifetimes and ages I

- Estimating lifetime solely on the basis of replacement times:
  - expected bridge lifetime is underestimated
- This problem can be resolved by statistical analysis on:
  - lifetimes of demolished bridges (complete observations):
    - \* lifetime is known to be  $t$
  - current ages of existing bridges (right-censored observations):
    - \* unknown lifetime  $t >$  current age  $y$



- current ages of existing bridges (right-censored observations):
  - \* unknown lifetime  $t >$  current age  $y$



## Statistical analysis of bridge lifetimes and ages II

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- Fit Weibull distribution:
  - properly models ageing of bridges
- Use maximum-likelihood method:
  - complete and right-censored observations
- Obtain conditional probability distribution of residual lifetime given current age:
  - left-truncated Weibull distribution

## Weibull distribution

A random variable  $X$  has a Weibull distribution with shape parameter  $a > 0$  and scale parameter  $b > 0$  if the probability density function of  $X$  is given by

$$\ell(x|a,b) = \text{We}(x|a,b) = \frac{a}{b} \left[ \frac{x}{b} \right]^{a-1} \exp \left\{ - \left[ \frac{x}{b} \right]^a \right\} I_{(0,\infty)}(x),$$

where  $I_A(x) = 1$  if  $x \in A$  and  $I_A(x) = 0$  if  $x \notin A$  for every set  $A$ .

The survival function is defined by

$$\bar{F}(x|a,b) = 1 - F(x|a,b) = \exp \left\{ - \left[ \frac{x}{b} \right]^a \right\}$$

with expected value  $E(X) = b\Gamma(a^{-1} + 1)$ .

## Left-truncated Weibull distribution

Condition on current life or age  $y$  and determine the conditional probability that lifetime  $X$  exceeds  $x$  given  $X > y$ :

$$\Pr\{X > x | X > y\} = \bar{F}(x|a, b, y) = \exp\left\{-\left[\frac{x}{b}\right]^a + \left[\frac{y}{b}\right]^a\right\}$$

for  $x > y$ .

Probability density function of left-truncated Weibull distribution:

$$\text{LTW}(x|a, b) = \frac{a}{b} \left[\frac{x}{b}\right]^{a-1} \exp\left\{-\left[\frac{x}{b}\right]^a + \left[\frac{y}{b}\right]^a\right\} I_{(y, \infty)}(x).$$

where  $X - y$  is the residual (or excess) lifetime for a bridge having age  $y$ .

## Likelihood of lifetimes and ages

- Let  $\mathbf{x} = (x_1, \dots, x_r)'$  denote a random sample of  $r$  complete lifetimes.
- Let  $\mathbf{y} = (y_1, \dots, y_m)'$  denote a random sample of  $m$  right-censored lifetimes (ages).
- Maximise the likelihood function

$$\ell(\mathbf{x}, \mathbf{y} | a, b) = \prod_{i=1}^r \ell(x_i | a, b) \prod_{j=1}^m \bar{F}(y_j | a, b).$$

## *Dutch stock of concrete bridges: Lifetimes*

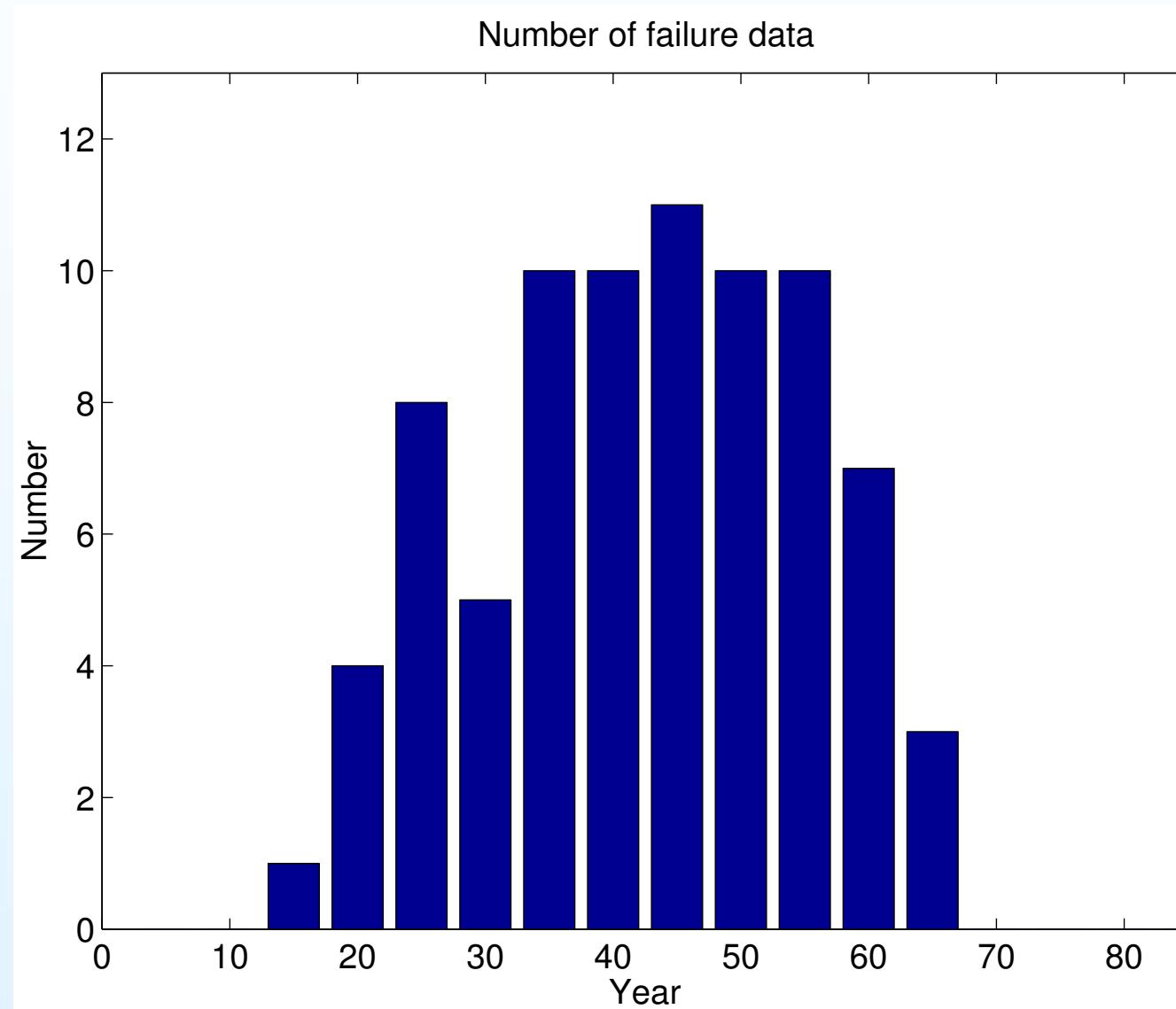
## Stock of concrete bridges

- Dutch stock of concrete bridges and viaducts in and over the highway
- Observed lifetimes and ages of concrete bridges were aggregated:
  - $r = 79$  lifetimes of demolished bridges (all with length less than 200 m)
  - $m = 2974$  ages of existing bridges
  - for 94 concrete bridges, the year of construction was unknown
- Right-censored observations available in terms of units of time of 1 year
  - discrete-time stochastic process

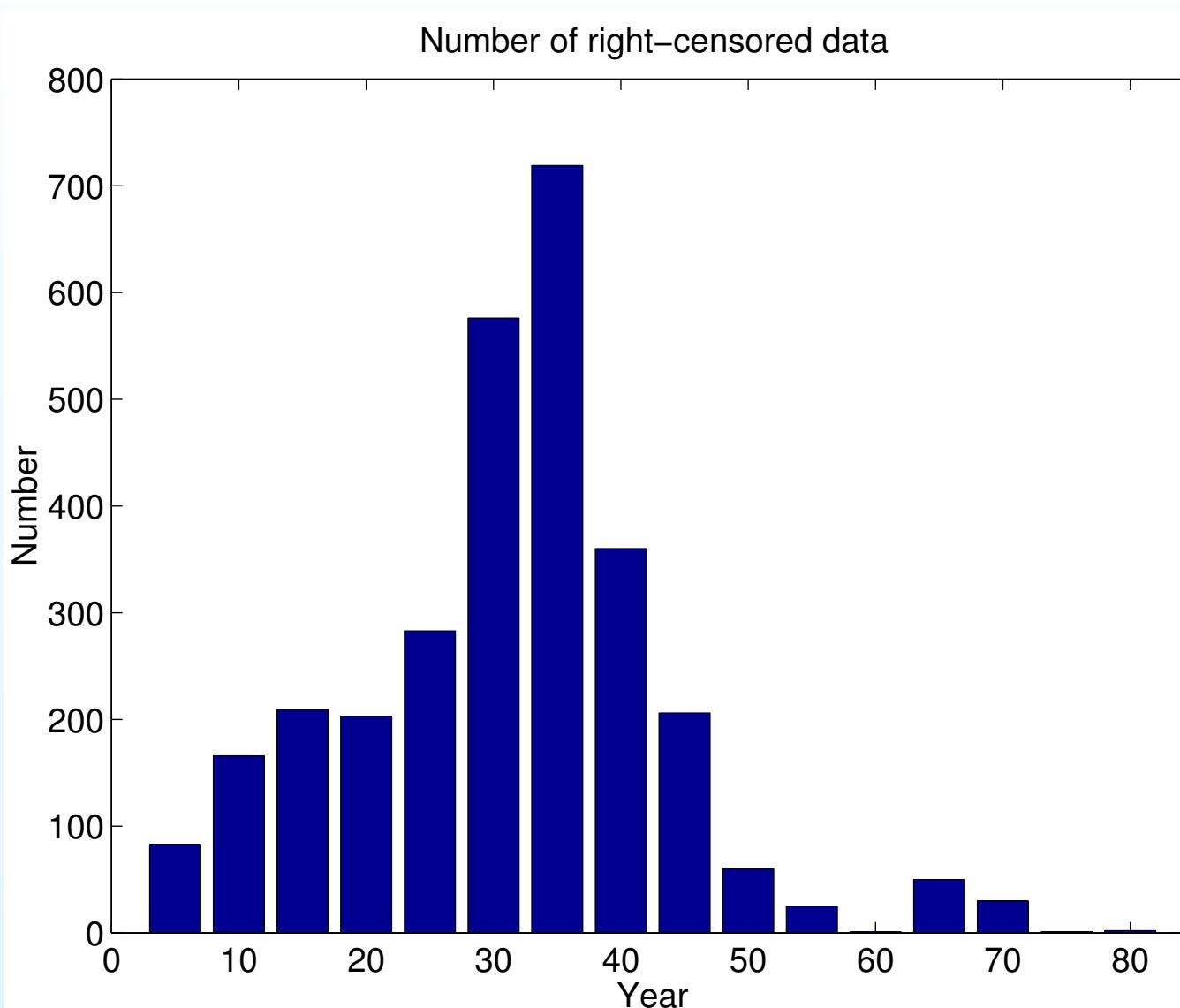
## Types of failure and changes in design

- Most demolished bridges were *not* replaced due to technical failure, but due to a change in functional or economical requirements
- Not enough information for making a distinction between the technical, functional and economical lifetime
- Possible changes in bridge design over time could not be taking into account

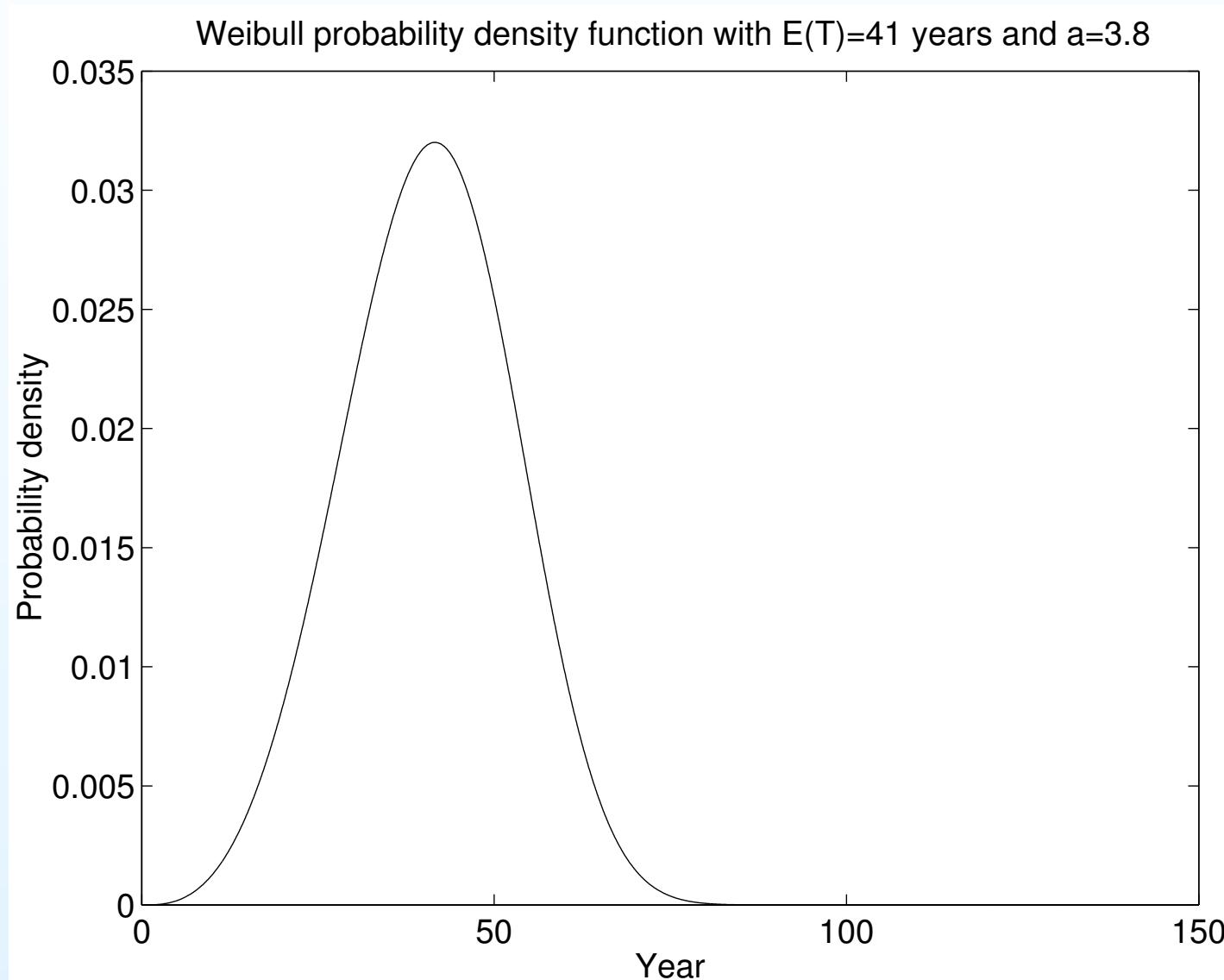
# Number of demolished bridges



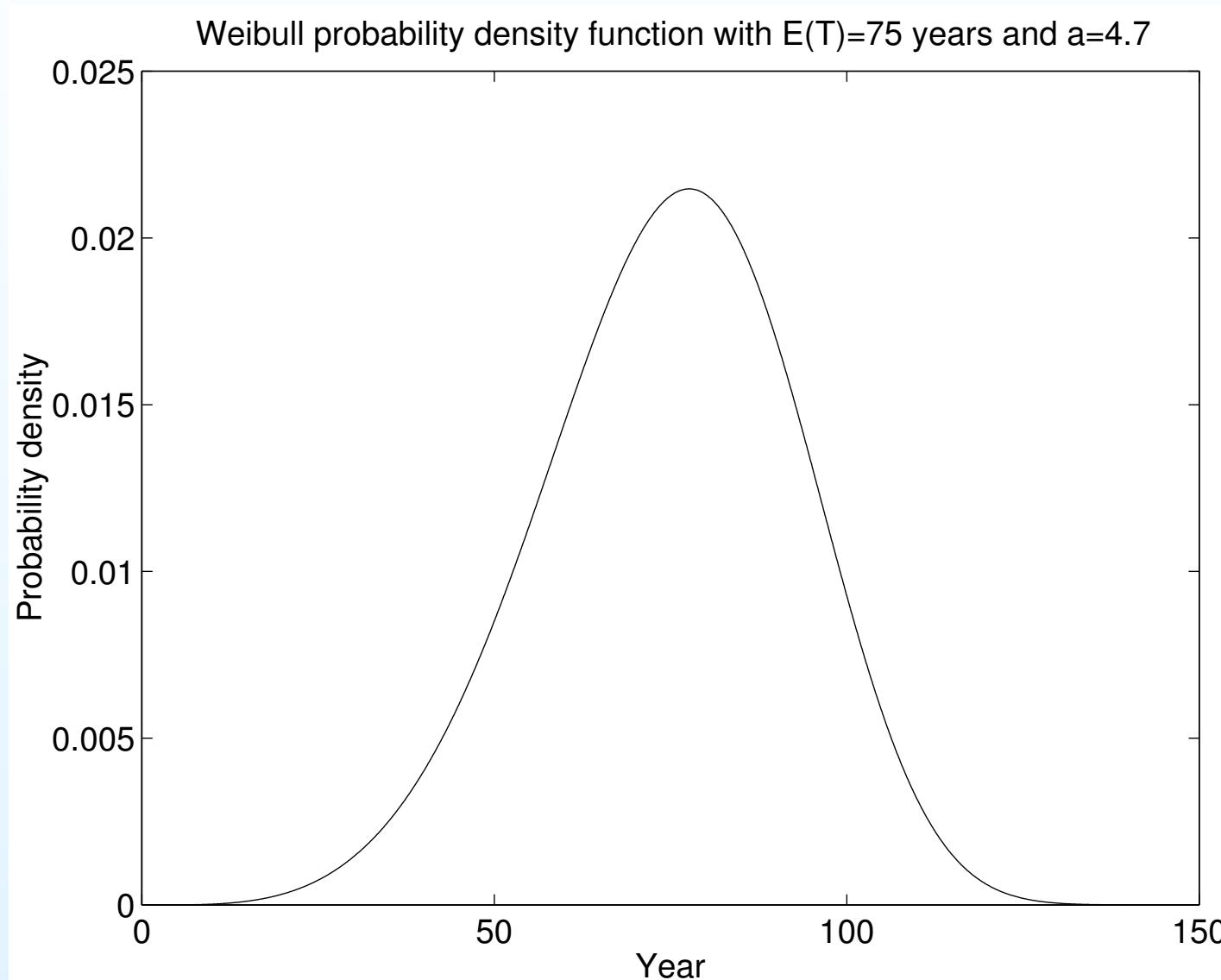
# Number of existing bridges



# Lifetime distribution: Demolished bridges



# Lifetime distribution: Demolished and existing bridges



## *Expected cost of bridge replacement*

## Bridge replacement as a renewal process

- Estimate future expected cost of replacing the bridge stock
  - as a function of time
  - when the current ages are given
  - while taking account of the uncertainty in the lifetime by applying techniques from renewal theory
- Assume bridge replacement can be modelled as a discrete renewal process:
  - renewals are the replacements
  - after each renewal we start (in a statistical sense) all over again

## Discrete renewal process

- A discrete renewal process  $N(n)$ ,  $n = 1, 2, 3, \dots$ , is a non-negative integer-valued stochastic process that registers the renewals in time interval  $(0, n]$
- Let the renewal times  $T_1, T_2, T_3, \dots$ , be non-negative, independent, identically distributed, random quantities having the discrete probability function

$$\Pr\{T_k = i\} = p_i = F(i|a, b, 0) - F(i-1|a, b, 0),$$

$i = 1, 2, \dots$ , where  $p_i$  represents the probability of a renewal in unit time  $i$

## Expected number and cost of renewals

- Expected number of renewals solves recursive equation

$$E(N(n)) = \sum_{i=1}^n p_i [1 + E(N(n - i))]$$

for  $n = 1, 2, 3, \dots$  and  $N(0) \equiv 0$ .

- When the cost of a renewal equals  $c$ , the expected cost over the bounded horizon  $(0, n]$  is

$$E(K(n)) = cE(N(n)).$$

- Expected long-term average number of renewals per unit time is

$$\lim_{n \rightarrow \infty} \frac{E(N(n))}{n} = \frac{1}{\sum_{i=1}^{\infty} ip_i} = \frac{1}{\mu}$$

being the reciprocal of the mean lifetime  $\mu$ .

## Delayed renewal process

- Expression for  $E(N(n))$  can be extended to the situation in which the first bridge has age  $y \geq 0$ .
- Discretise the probability distribution of the residual lifetime:

$$\Pr\{\tilde{T} = i|y\} = q_i(y) = F(y + i|a, b, y) - F(y + i - 1|a, b, y),$$

$$i = 1, 2, \dots$$

- Expected number of renewals in time interval  $(0, n]$  when the first bridge has age  $y$  can then be written as

$$E(\tilde{N}(n, y)) = \sum_{i=1}^n q_i(y) [1 + E(N(n - i))].$$

- Because the renewal process only starts from the second renewal on, the stochastic process  $\{\tilde{N}(n, y), n = 1, 2, 3, \dots\}$  is called a *delayed renewal process*.

## Expected cost of bridge replacement

- Expected cost of replacement of a bridge stock can be obtained by summing the expected replacement cost over the current ages  $y_1, \dots, y_m$ :

$$E(\tilde{K}(n)) = \sum_{j=1}^m c_j E(\tilde{N}(n, y_j)),$$

where  $c_j$  is the cost of replacing the  $j$ th concrete bridge.

- Expected cost in unit time  $i$  is

$$E(\tilde{K}(i)) - E(\tilde{K}(i-1)), \quad i = 1, \dots, n.$$

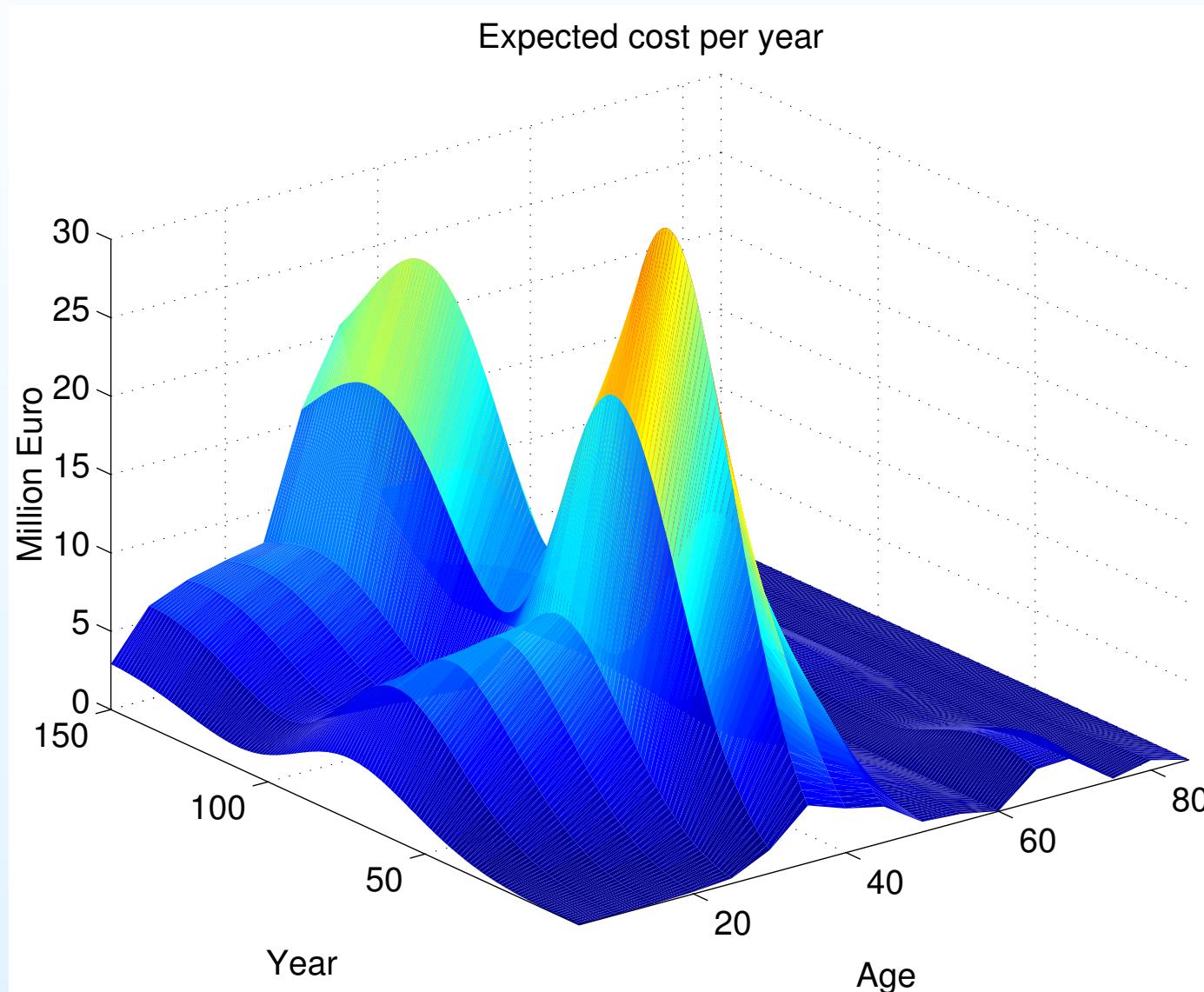
## *Dutch stock of concrete bridges: Cost*

## Replacement value of Dutch bridge stock

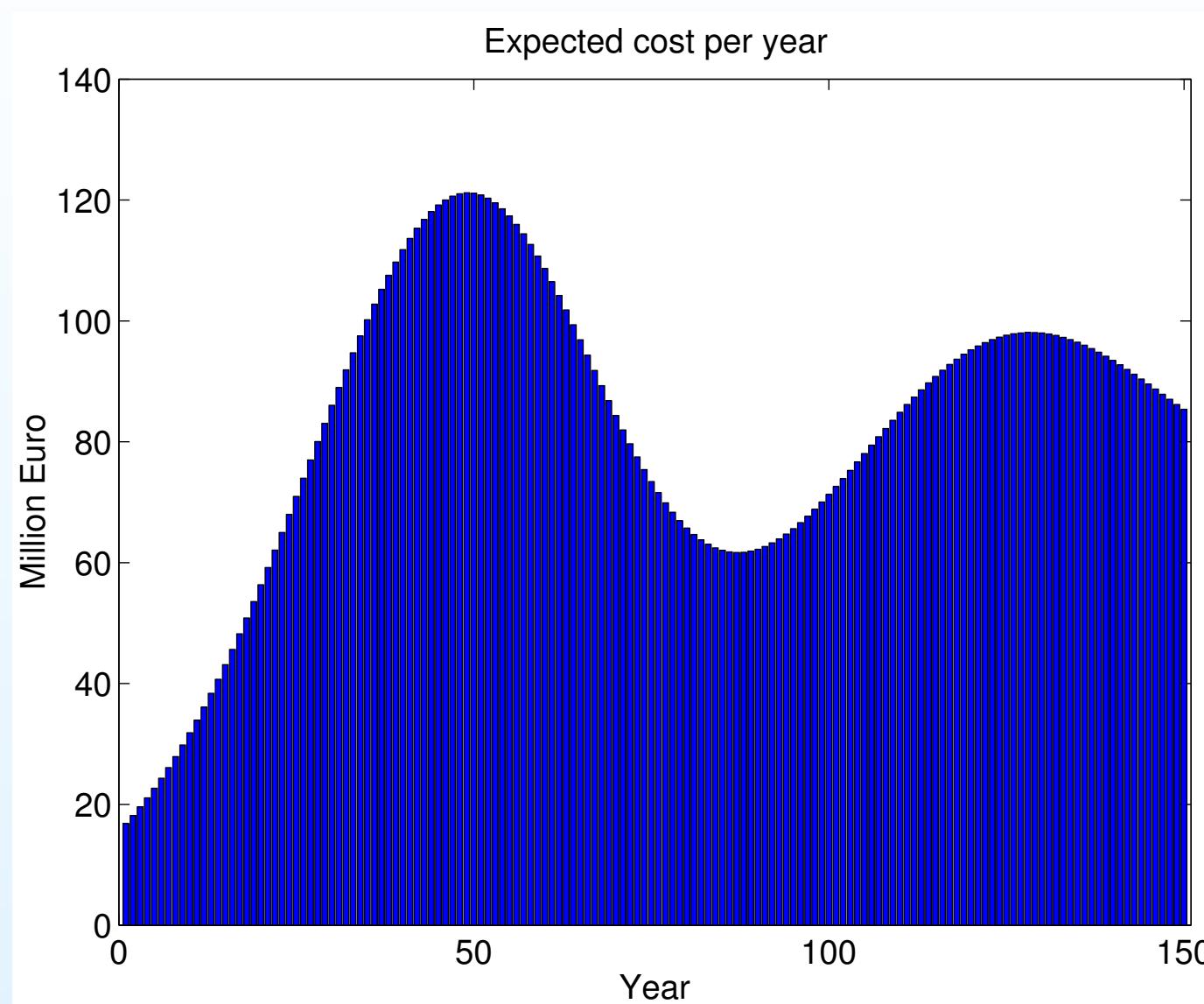
- Although an old bridge is seldom replaced by the same type of bridge, it is difficult to accurately assess the cost of such a new bridge
- Let cost of replacement therefore be independent of time:
  - replacement value of single bridge:  $c = 2.15$  million Euro
- Replacement value of bridge stock
  - with known years of construction:  $6.38 \times 10^9$  Euro
  - with unknown years of construction:  $1.30 \times 10^8$  Euro
  - with correction factor for bridges with unknown years of construction:

$$\frac{6.38 \times 10^9 + 1.30 \times 10^8}{6.38 \times 10^9} = 1.02$$

# Expected cost per unit time when ages are given



## Expected cost per unit time summed over all ages

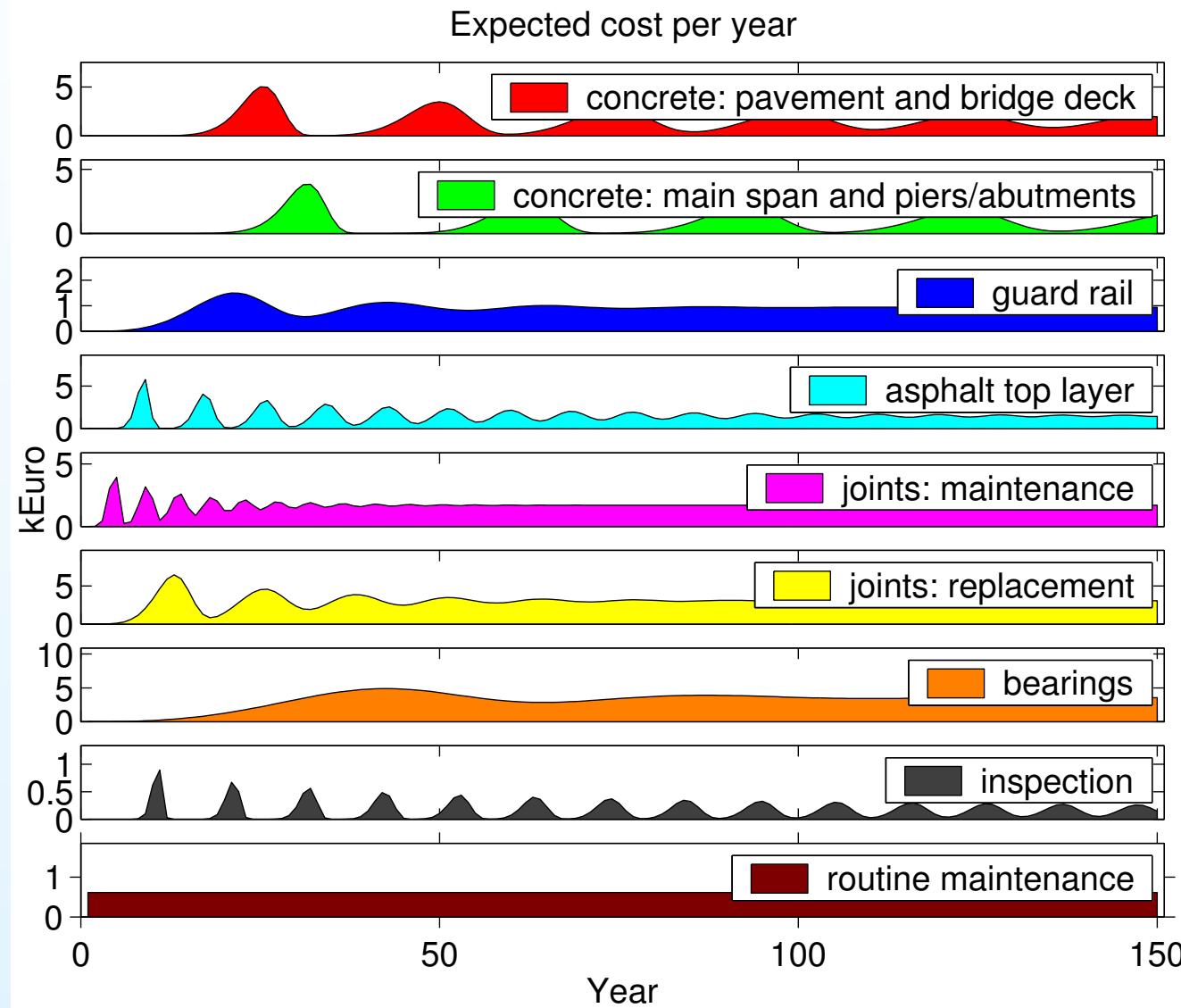


## Maintenance of concrete bridge elements

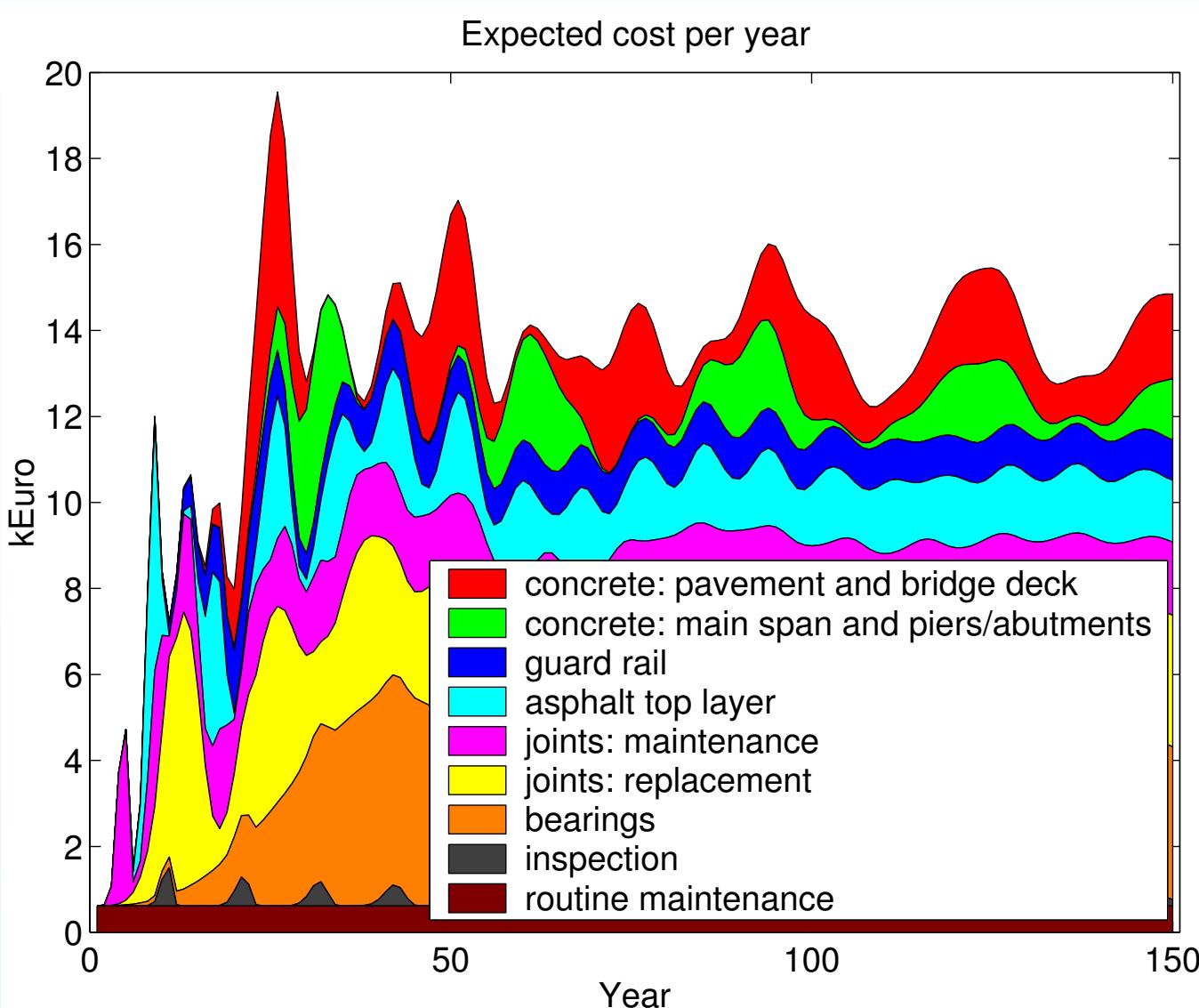
Bridge element	Cost [EUR]	Interval [year]	CV [-]
Concrete:			
- Pavement and bridge deck	36364	24	0.12
- Main span and piers/abutments	27360	30	0.10
Guard rail	19224	20	0.26
Asphalt top layer	12852	8	0.11
Joints: maintenance	7648	4	0.15
Joints: replacement	38240	12	0.20
Bearings	145000	40	0.30
Inspection	1650	10	0.06
Routine maintenance	617	1	0.00

CV = Coefficient of Variation

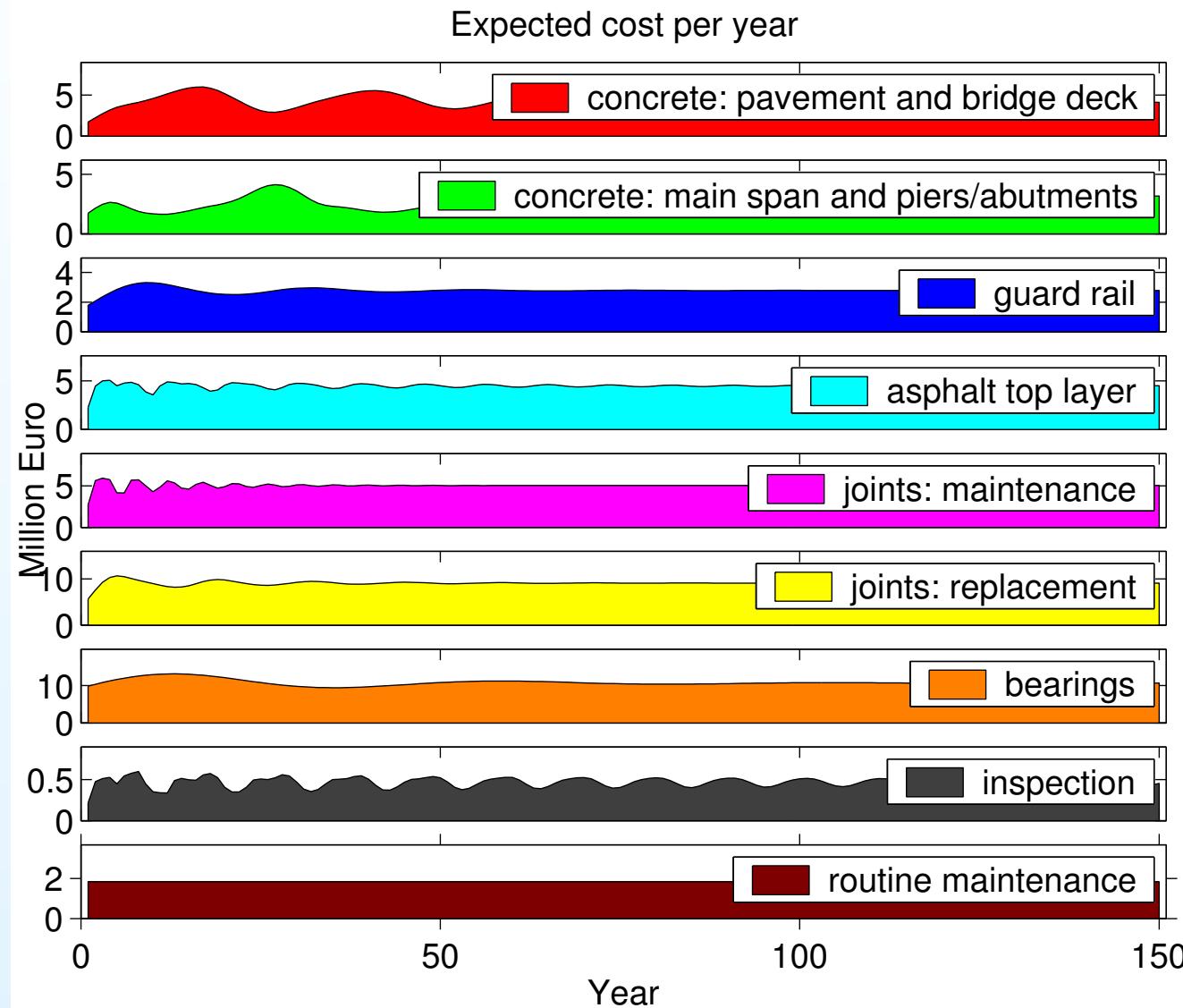
# Maintenance cost of bridge elements for one bridge I



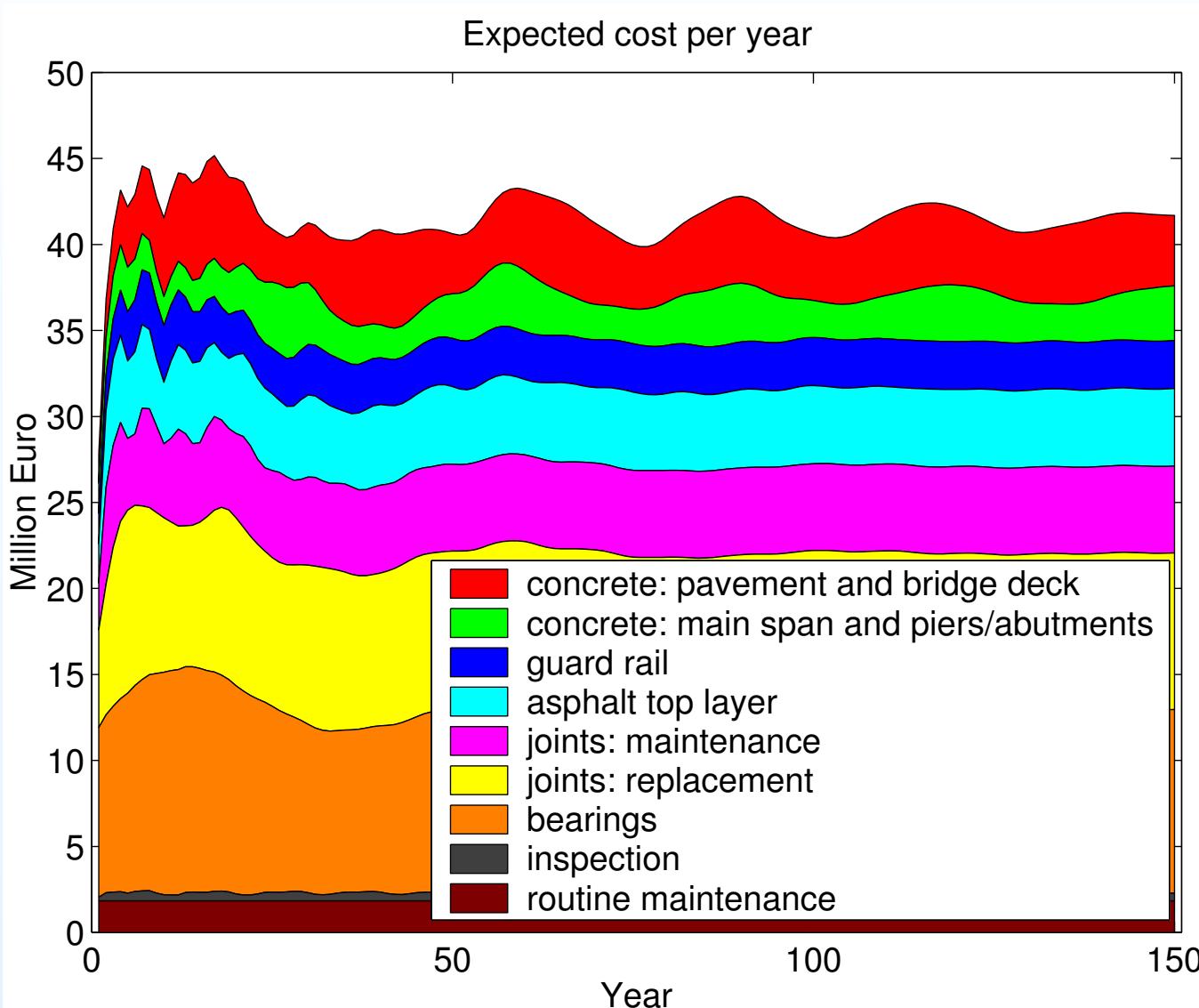
# Maintenance cost of bridge elements for one bridge II



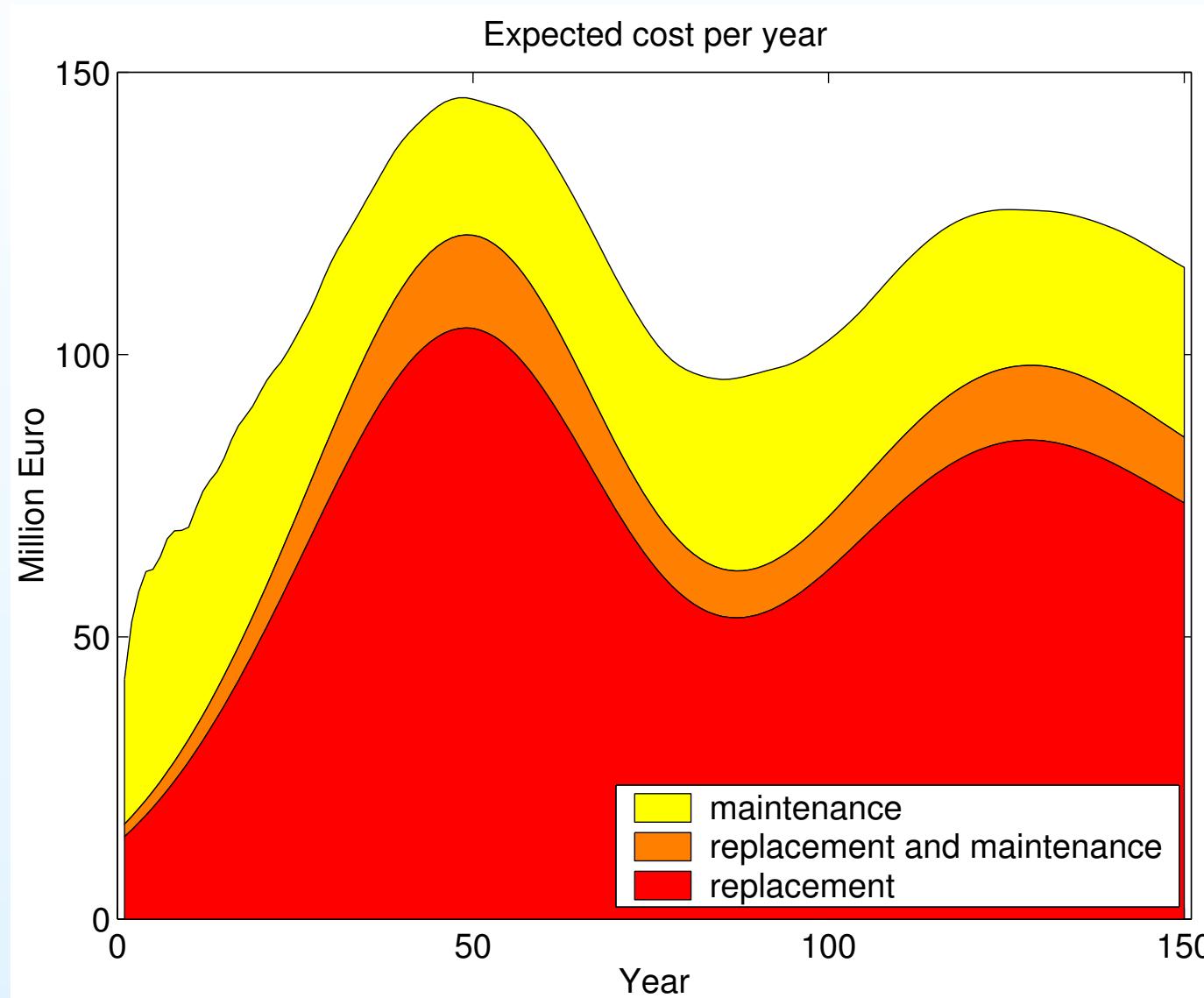
# Maintenance cost of bridge elements for all bridges I



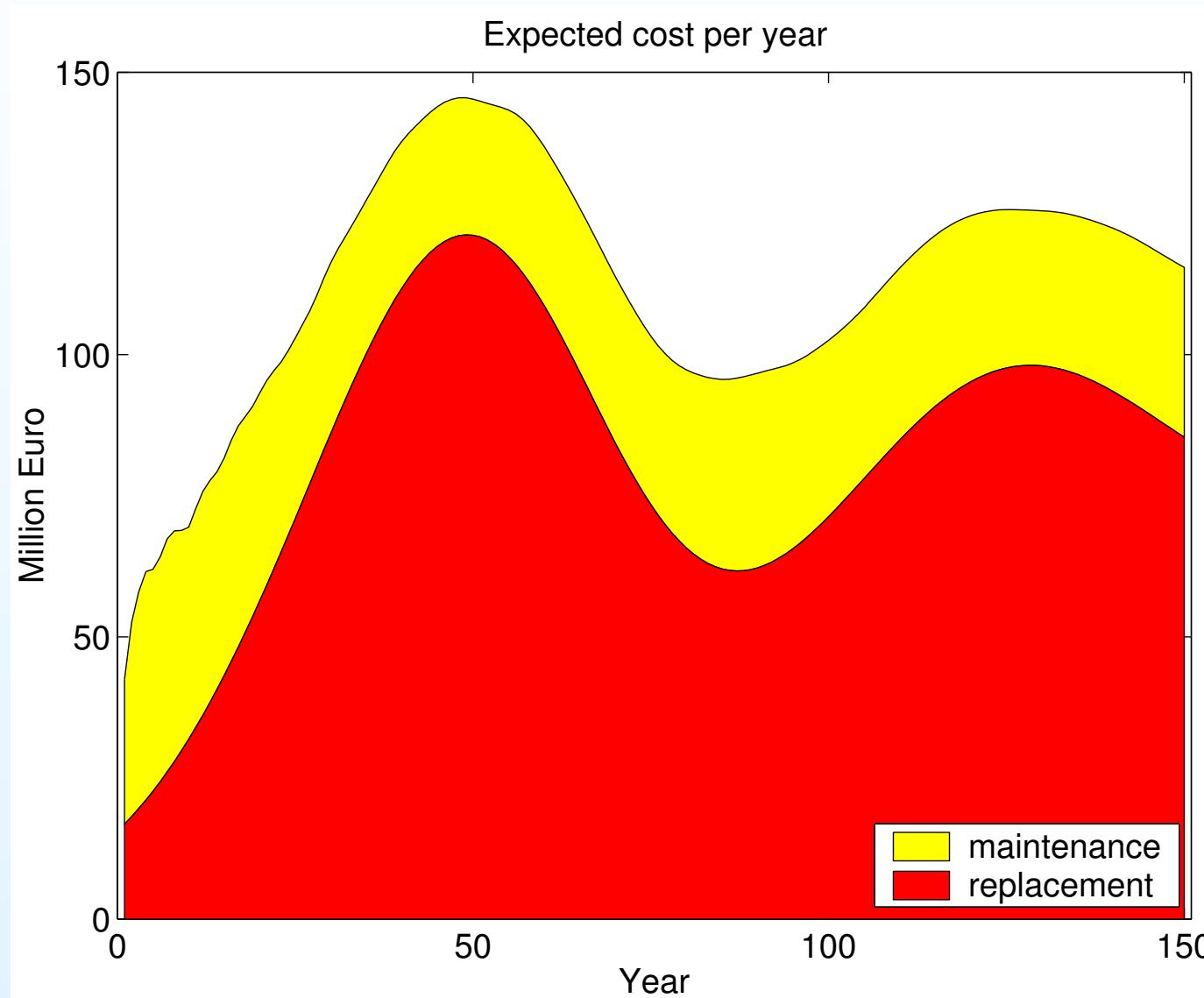
## Maintenance cost of bridge elements for all bridges II



# Cost of maintenance and replacement for all bridges



# Cost of maintenance and replacement for all bridges



## Long-term expected average cost per unit time

- Cost of replacing one concrete bridge: 2.15 Million Euro
- Long-term expected average cost per year for one bridge:
  - replacement cost: 28 kEuro per year
  - maintenance cost: 15 kEuro per year
- Long-term expected average cost per year for bridge stock:
  - replacement cost: 86 Million Euro per year
  - maintenance cost: 44 Million Euro per year
- For the purpose of life-cycle costing:
  - expected cost of replacement as a function of time
  - expected average cost of maintenance per year

## *Conclusions*

## Conclusions

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- Lifetime distribution of Dutch concrete bridges has been determined
- Weibull distribution was fitted to
  - complete lifetimes of demolished bridges
  - current ages of existing bridges
- Expected value of the Weibull lifetime in agreement with usual design life:
  - 80 to 100 years
- Advantages of Weibull distribution:
  - possibility to properly model ageing
  - analytically derive the conditional probability density function of residual lifetime when current age is given

## Conclusions (continued)

- Using renewal theory, the expected cost of replacing and maintaining the bridge stock has been determined:
  - take account of ages of individual bridges
- Uncertainties in replacement and maintenance times:
  - cost is more spread out over time
- For the purpose of life-cycle costing:
  - expected cost of replacement as a function of time
  - expected average cost of maintenance per year
- Methodology can be extended:
  - different types of lifetime (such as technical, functional and economical)
  - possible change of bridge design over time