

# Investigation of methods to assess the individual relationship between the RR and QT interval of the ECG

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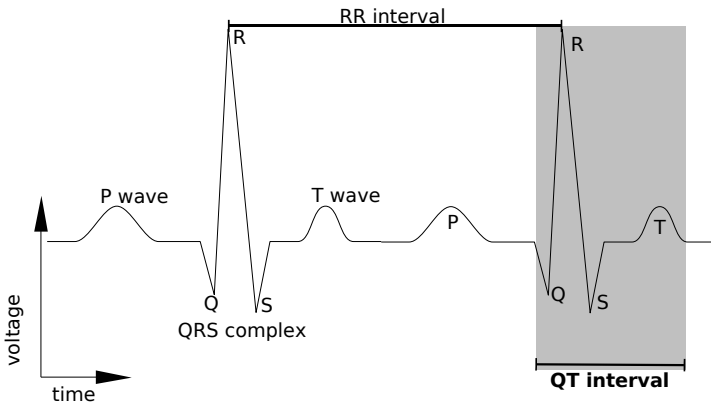
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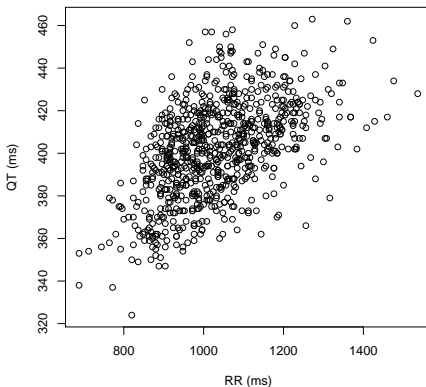
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# ECG Wave Form

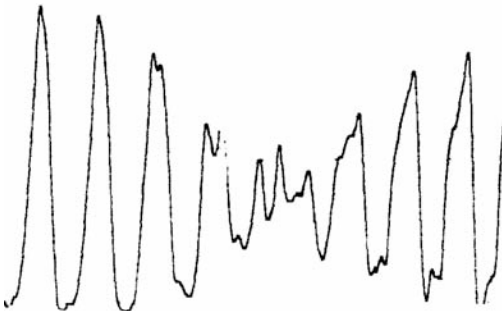


# Scatter Plot of RR/QT Intervals



Scatter plot of a subsample of the study data set, including observations of several subjects

# Torsade de Pointes — "Twisting of the points"



(Horacek T. (1998): Der EKG-Trainer. Thieme, Stuttgart)

- Special case of ventricular tachycardia
- Typical "twisted" appearance in the ECG

# Torsade de Pointes 2

- Can lead to arrhythmia and death
- Can be caused by insufficient repolarisation in heart cells
- Several pharmaceutical agents are known to make TdP more likely
- Relative prolongation of the QT interval can be used as a surrogate endpoint

# Problems

- QT length depends on RR ( $= 1 / \text{Heart Rate}$ )
- Change of heart rate causes QT effect even if repolarisation is not affected
- No simple linear relationship
- Dependence appears to be individual

Aim: a *corrected* QT interval which can be interpreted independently of the heart rate

# Classic Approaches

Simple, generally applicable formula?

- Fridericia (1920):  $QTcF = \frac{RR}{\sqrt[3]{QT}}$
- Bazett (1920):  $QTcB = \frac{RR}{\sqrt{QT}}$
  
- + easy to calculate
- + depends only on actual RR and QT
- - imprecise: often high correlation between RR and QTc, known miscorrection
- - does not account for individual characteristics



# QTcB and QTcF

Both Fridericia and Bazett imply the same principle:

$$QT = a \cdot RR^b \quad \Leftrightarrow \ln QT = \ln a + b \cdot \ln RR \quad (\text{parabolic})$$

Alternatives:

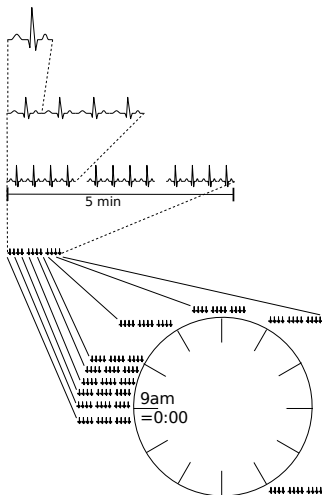
$$QT = a + b \cdot RR \quad (\text{linear})$$

$$QT = \exp(a + b \cdot RR) \quad \Leftrightarrow \ln QT = a + b \cdot RR \quad (\text{log/linear})$$

# General Information about the Study

- EKG data of a Thorough QT Study performed at Boehringer Ingelheim (see poster BM-17 for details)
- Baseline days of each of the four crossover cycles
- 96 or 144 RR/QT pairs per day and person
- 56 subjects,  $\approx 29.000$  wave forms overall

# Structure of ECG Recordings



One ECG wave

Four successive ECG waves

Three sequences within  
a five minute interval

8 – 12 intervals throughout  
one day, at different distances

Measurement time points  
(relative to drug application  
on the next day):

-0:10	0:40	4:00
0:05	1:00	8:00
0:10	2:00	12:00
0:20	3:00	23:50

# Modeling

Find useful models for RR/QT dependence incorporating

- 1 Individual effects
- 2 Temporal correlation of measurements
- 3 Circadian effects

→ Linear Mixed Effects Model including

- 1 Random effects (intercept and slope) per subject
- 2 Temporal correlation of residuals
- 3 Cosinusoidal representation of time

# Models

Transformation 1  
(log/log)

$$x_{ijkl} = \ln RR_{ijkl}$$

$$y_{ijkl} = \ln QT_{ijkl}$$

Transformation 2  
(linear)

$$x_{ijkl} = RR_{ijkl}$$

$$y_{ijkl} = QT_{ijkl}$$

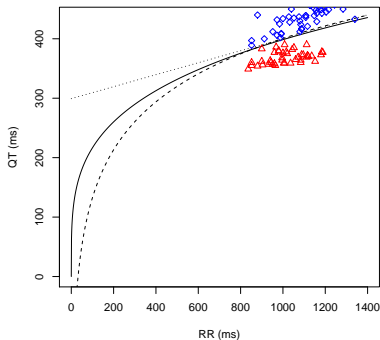
Transformation 3  
(log/linear)

$$x_{ijkl} = RR_{ijkl}$$

$$y_{ijkl} = \ln QT_{ijkl}$$

- $i$ : index of subject
- $j$ : index of period (day)
- $k$ : index of time point within day
- $l$ : index of repetition within time point
- $t_{ijkl} = t_l$  relative time of observation ( $x_{ijkl}, y_{ijkl}$ )

# Models



solid line: Transformation 1 (log/log), dotted line: Transformation 2 (linear)

dashed line: Transformation 3 (log/linear) blue rhombes/red triangles: data of two individuals

# Model without Circadian Effect

$$y_{ijkl} = (a + \alpha_i) + (b + \beta_i) \cdot x_{ijkl} + \epsilon_{ijkl}$$

$(\alpha_i, \beta_i)^T \sim N(0, \Sigma)$ ,  $\Sigma$  positive definite

$\epsilon_{ij} \sim N(0, R)$  i.i.d. (vector of all observations of subject  $i$  in day  $j$ )

- $R_{\text{uncorrelated}} = \sigma^2 I$
- $R_{\text{exp}} = \sigma^2 \exp\left(\frac{-d_{l_q l_r}}{\rho}\right)$ ,  $d_{l_q l_r} = |t_{l_q} - t_{l_r}|$
- $R_{\text{Gauss}} = \sigma^2 \exp\left(\frac{-d_{l_q l_r}^2}{\rho^2}\right)$ ,  $d_{l_q l_r} = |t_{l_q} - t_{l_r}|$

# Model with Circadian Effect

$$y_{ijkl} = (a + \alpha_i) + (b + \beta_i) \cdot x_{ijkl} + \sum_{p=1}^m \left( (c_p + \gamma_{pi}) \cdot \cos \frac{p \cdot t_{ijkl}}{1440} + (d_p + \delta_{pi}) \cdot \sin \frac{p \cdot t_{ijkl}}{1440} \right) + \epsilon_{ijkl}$$

$(\alpha_i, \beta_i, \gamma_{1i}, \dots, \gamma_{mi}, \delta_{1i}, \dots, \delta_{mi})^T \sim N(0, \Sigma)$ ,  $\Sigma$  positive definite  
 $\epsilon_{ij} \sim N(0, R)$  i.i.d. (vector of all observations of subject  $i$  in day  $j$ )

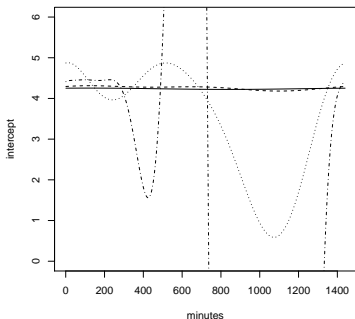




Example: Transformation 1 (parabolic)

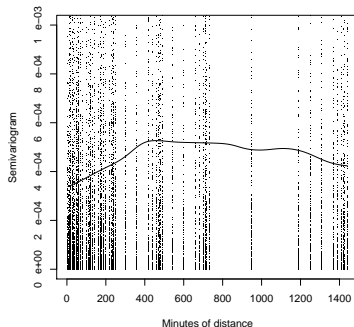
# Cosinusoidal component and semivariogram

cosinusoidal curves



line:m=1 dashed:m=2 dotted:m=3 dot/dash:m=4

semivariogram for  $m=3$ ,  $R = \sigma^2 I$



"raw" residuals; line: Nadaraya-Watson estimate

# Model Selection: Akaike Information Criterion

$$AIC = -2l + 2d \text{ (smaller is better)}$$

- $l$ : Maximum log likelihood
- $d$ : Dimension of the model

	Trans- formation 1 (log/log)	Trans- formation 2 (linear)	Trans- formation 3 (log/linear)
$m=0, R = \sigma^2 I$	-10138	18212	18155
$m=1, R = \sigma^2 I$	-10325	17999	17954
$m=2, R = \sigma^2 I$	-10451	17849	17806
$m=3, R = \sigma^2 I$	-10590	17687	17646
$m=3, R = R_{exp}$	<b>-10904</b>	<b>17366</b>	<b>17311</b>
$m=3, R = R_{Gau\beta}$	-10588	17689	17555

# External Validation: Test with Placebo Data

Comparison of Transformations by estimating QT intervals of observations not included in model building

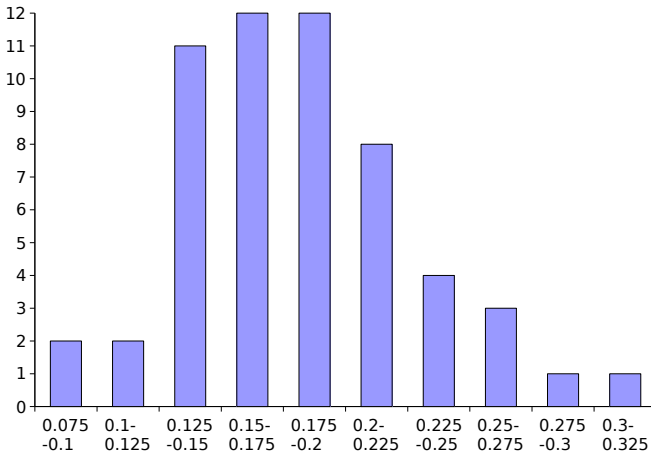
Model:  $m=3$ ,  $R = R_{exp}$

	Trans- formation 1 (log/log)	Trans- formation 2 (linear)	Trans- formation 3 (log/linear)
$\sum(\widehat{QT} - QT)^2$	<b>673.026</b>	691.531	680.424

⇒ Transformation 1 performs best

## Comparison of Models

## Individual slopes per subject



# Comparison of Aggregation Methods

Analysis of:

- Full data set (all wave forms)
- One randomly or systematically selected wave form per time point
- Mean values of all wave forms per time point

Estimations of the slope based on the first two methods are similar, while they differ substantially when mean values are used.

# Discussion

- Parabolic dependence appears to be superior
- Respecting temporal correlation of residuals reasonably increases the fit
- Circadian variability can be accounted for by a cosinusoid of third degree for twelve measurement time points in this special configuration

# References



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