



▶ POLITECNICO DI MILANO



Cardiovascular response analysis in healthy and pathologic subjects during exercise

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Walking restoration / exercise: Important role in pathologic subjects

- Spinal Cord Injury
- Hemiparesis after stroke
- Heart Failure

Difficult exercise training performance

- Robotic Assisted treadmill Training with Body Weigth Support
- Light Cycloergometer Exercise

?? Effects on the cardiovascular system



Cardiovascular response during Rehabilitation Protocols

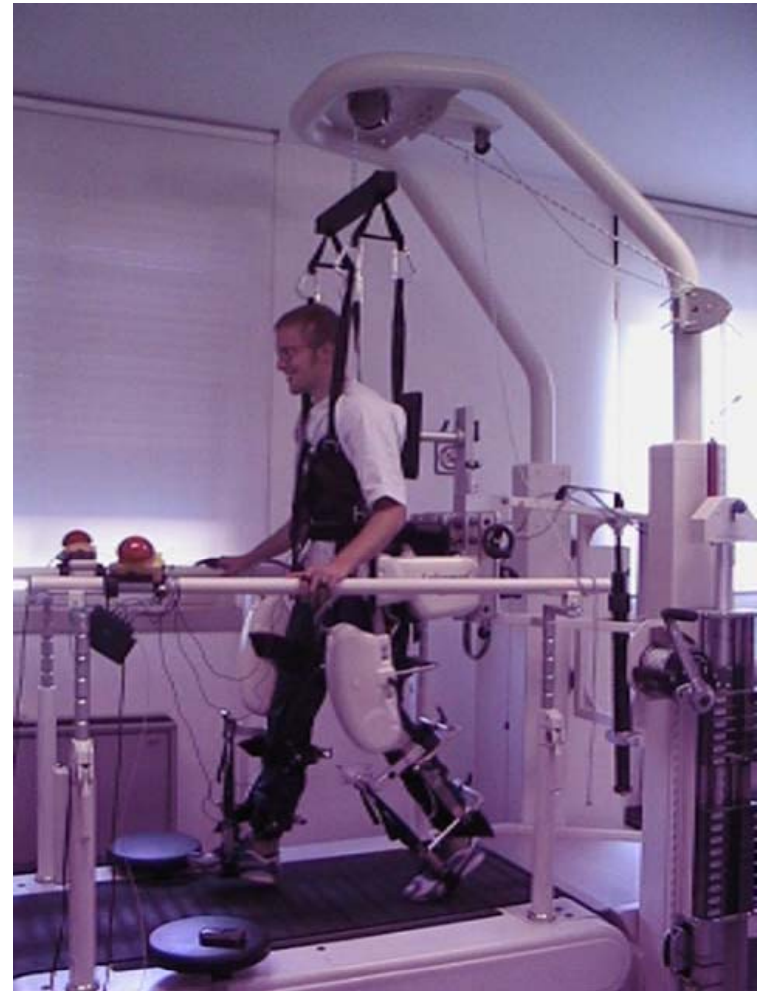
- Robotic Assisted treadmill Training
 - Experimental Protocols Identification
 - Signal Processing Methods
 - Results
- Light Cycloergometer Exercise → known cardiovascular modifications
 - Experimental protocol
 - Results
- Conclusions & Work in progress



emerging rehabilitation technique
for rehabilitation of patients with
lost sensorimotor function

Advantages

- no **continuous manual assistance**
- partial **body weight support**
 - delayed muscle fatigue
 - strength, endurance and coordination recovery
- extremity muscles adaptation to increasing metabolic demand



Lokomat® (Hocoma Medical Engineering Inc., Zurich)



Rehabilitation protocol:

- 45 min walk sessions, **5 days/w for 6 weeks**
- Hips and legs instrumentation procedure into the Lokomat requires **subject suspension for about 5 min**

What about the **effects of the rehabilitation strategy** on the cardiovascular system in healthy and pathologic subjects?

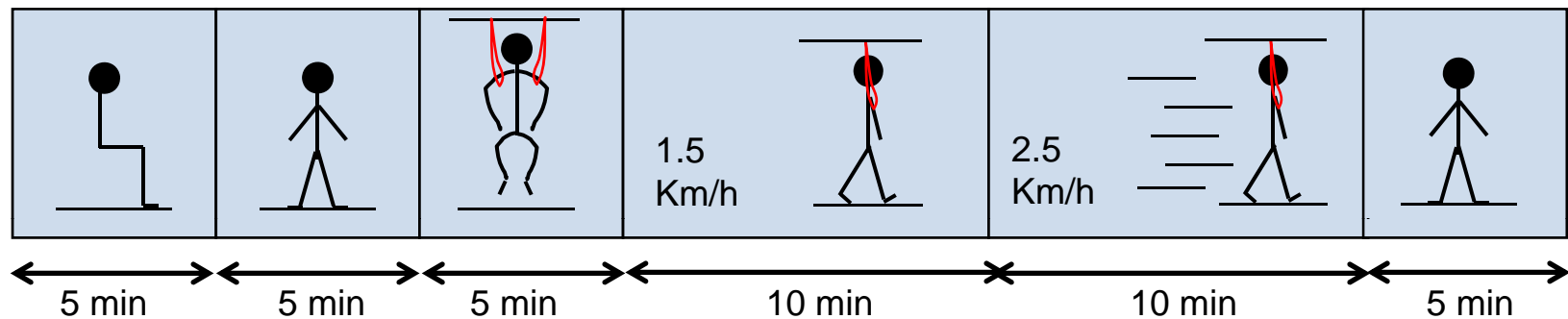
- Normal subjects
 - cardiovascular response evaluation
- Pathologic subjects
 - effects of the therapy on autonomic control system



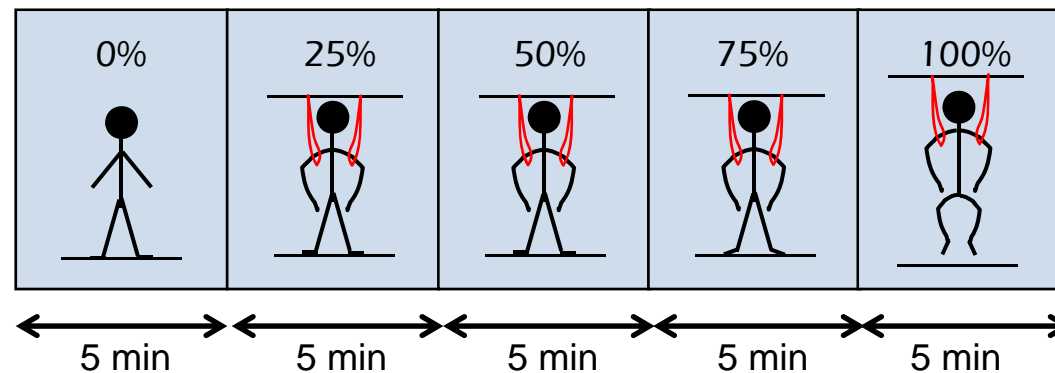
Experimental protocols: Normal subjects

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1. To investigate cardiovascular regulation during a traditional robotic-assisted locomotion protocol: (20 normal subjects, 25 ± 3.8 yrs, 11M)



2. To evaluate the autonomic nervous system response during BWS : (10 normal subjects, 23 ± 3.2 yrs, 7M)



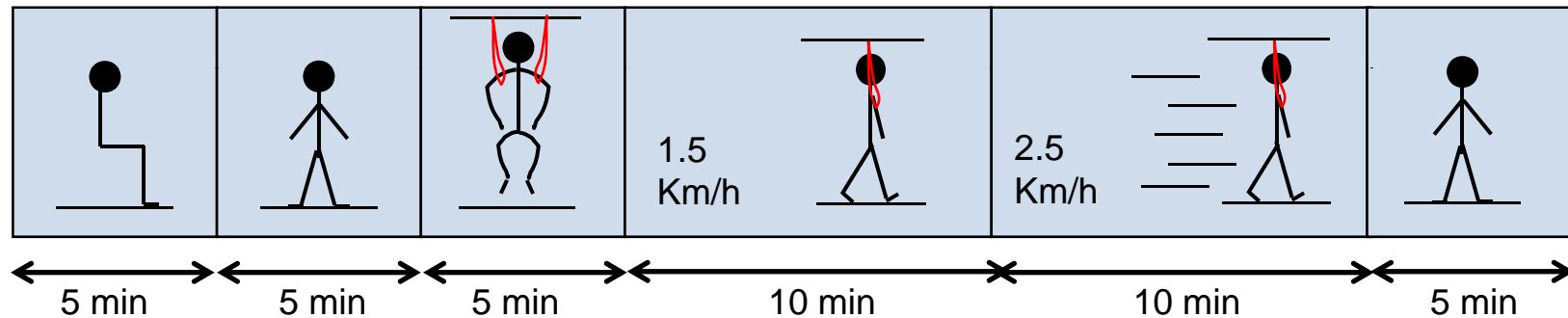


Experimental protocols: Stroke survivors

7

1. To investigate the effects of BWS treadmill training on the autonomic regulation of heart rate: (5 subjects after stroke, 58 ± 9 yrs, 5 M)

First & Last day of Lokomat treatment:



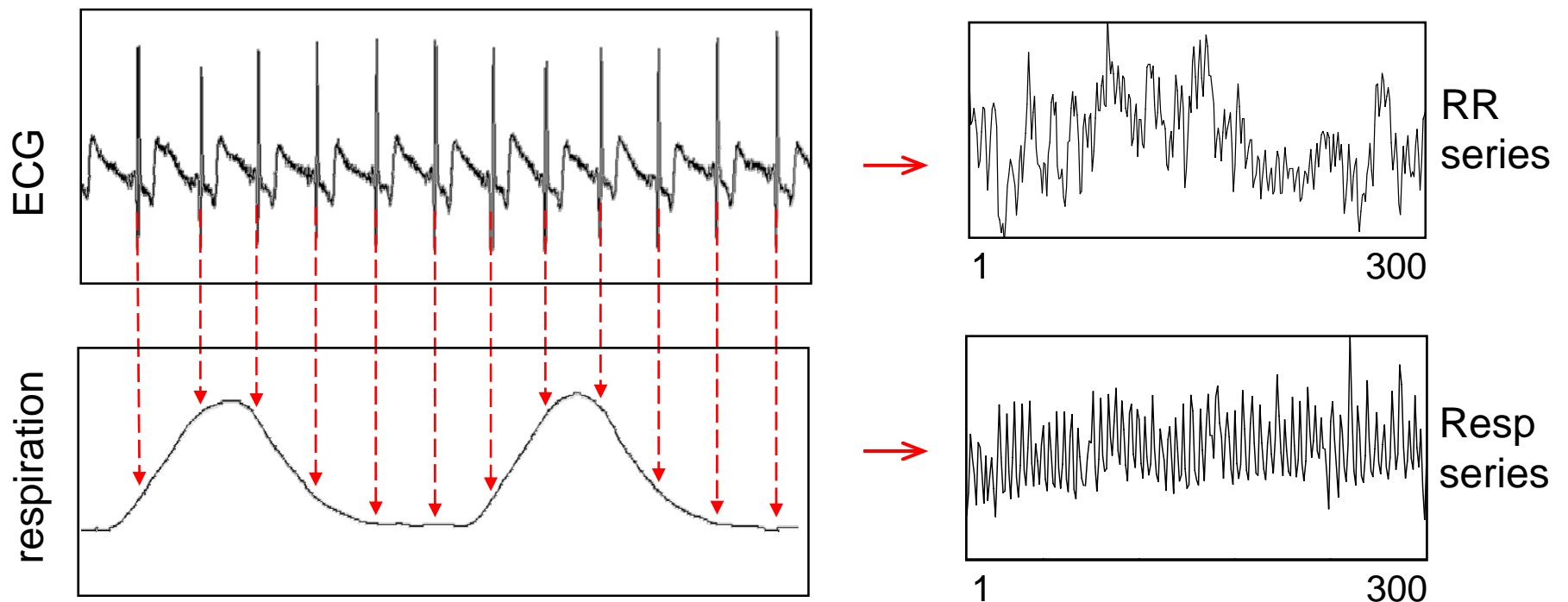
2. To investigate the gait improvement after Lokomat treatment

First & Last day of Lokomat treatment gait analysis



Cardiac monitoring during body weight supported locomotion protocol (heart rate; parasympathetic and sympathetic modulation)

- I-lead ECG signal ($f_s = 2048$ Hz)
- Respiratory frequency signal ($f_s = 256$ Hz)





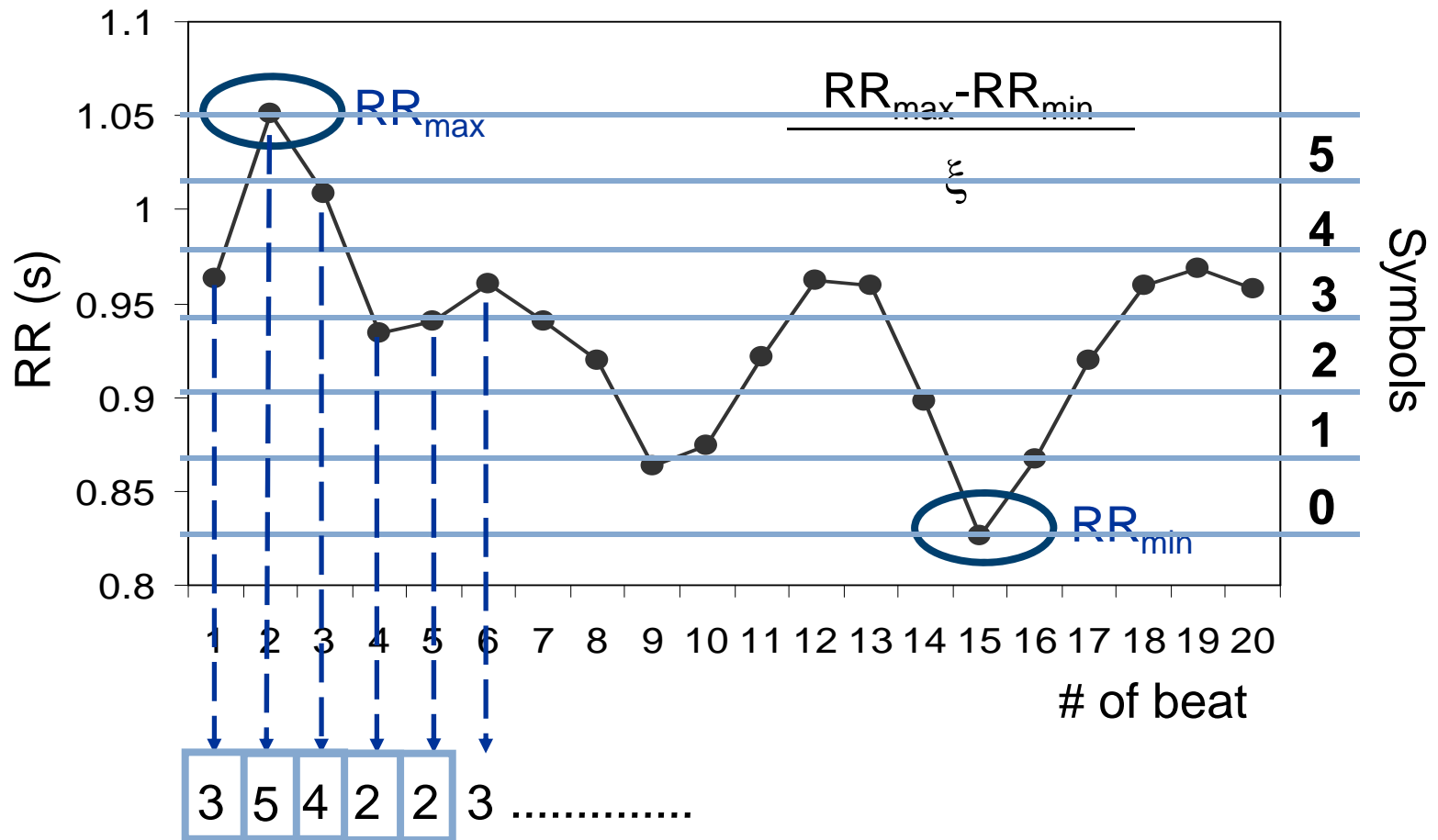
- Spectral Analysis:
 - **AR method** (*Task Force '96*)

- Decomposition by means of waveforms:
 - **Symbolic Analysis:** 3 beats long patterns
(*Porta A et al, 2001, IEEE Trans Biomed Eng 48*)
 - **Empirical Mode Decomposition:** Intrinsic Mode Functions
(*Huang NE et al, 1996, the Royal Society*)

- Complexity analysis: to evaluate sympato-vagal balance
 - **Local Non-Linear Prediction method**
(*Porta A et al, 2007, IEEE Trans Biomed Eng 54*)

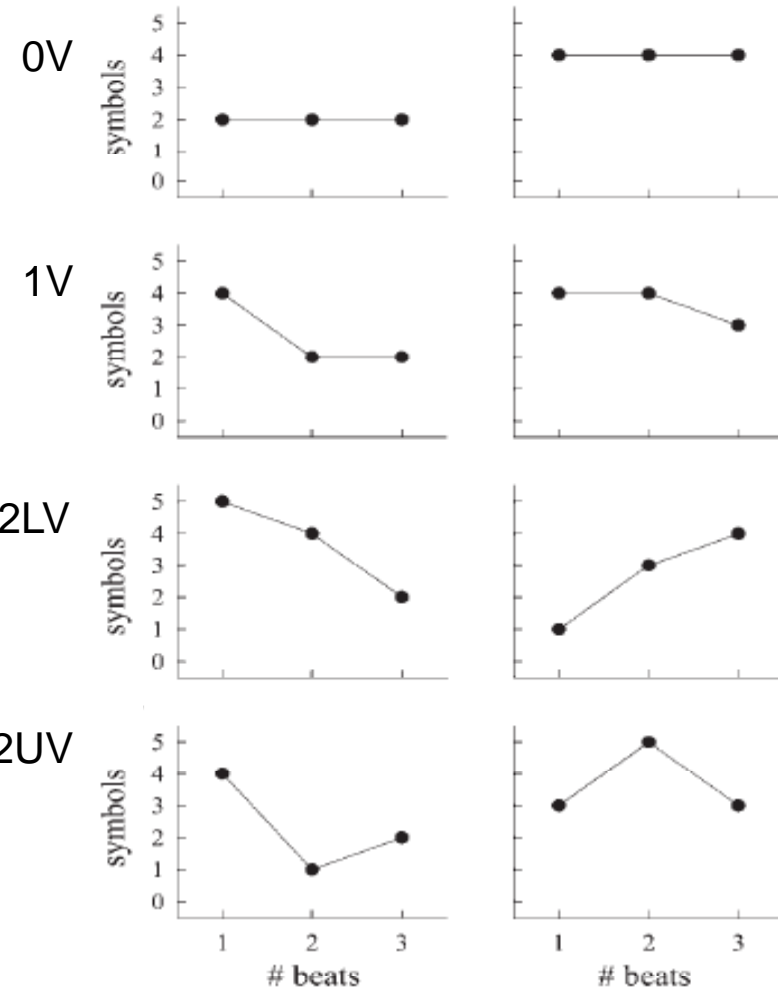
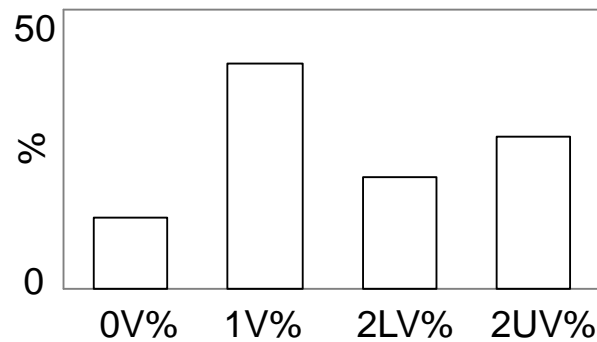
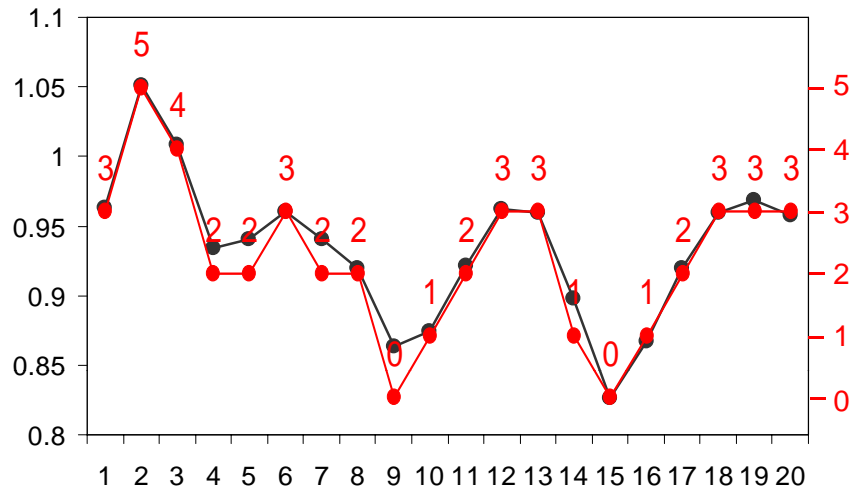


Methods: Symbolic Analysis (1)





Methods: Symbolic Analysis – Parameters Extraction

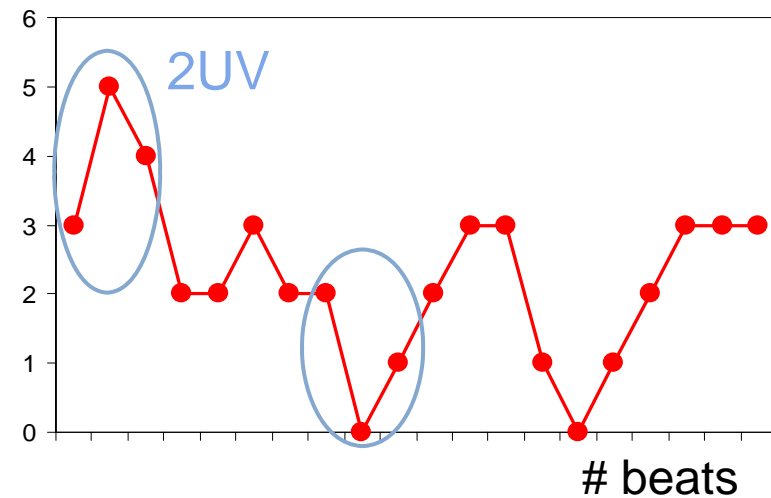
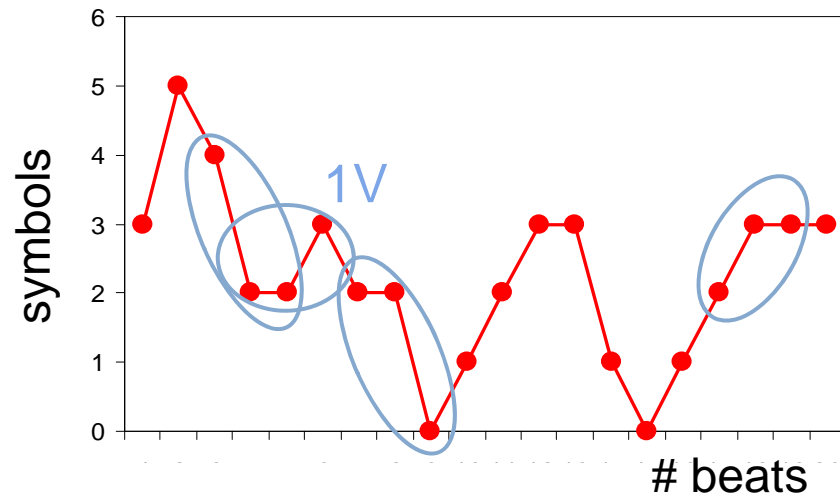
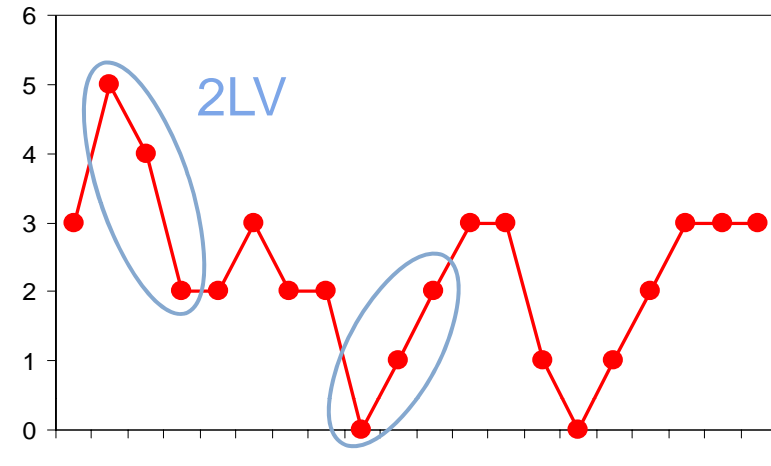
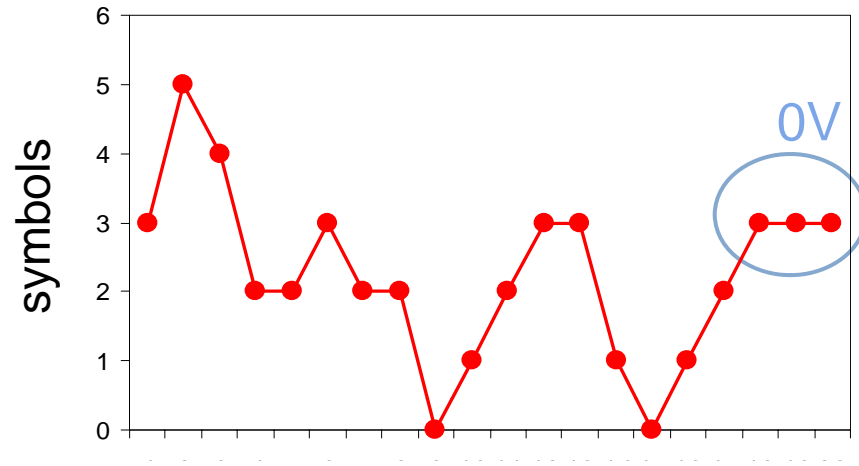


Porta A et al, 2001, IEEE Trans Biomed Eng 48



Methods: Symbolic Analysis – Parameters Extraction

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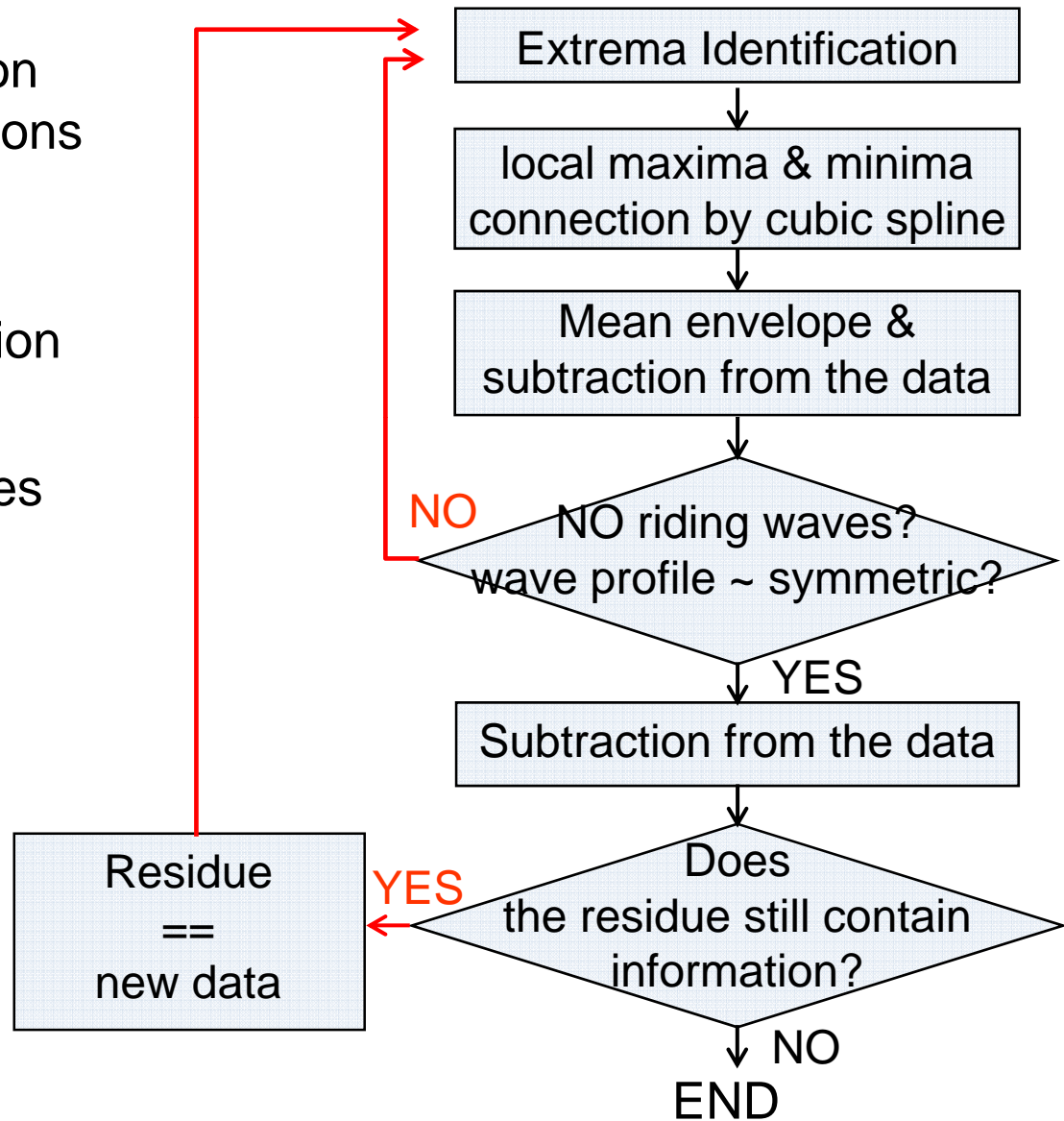
Methods: Empirical mode decomposition (1)

Time series decomposition into Intrinsic Mode Functions

- Hilbert transform
- instantaneous frequencies calculation

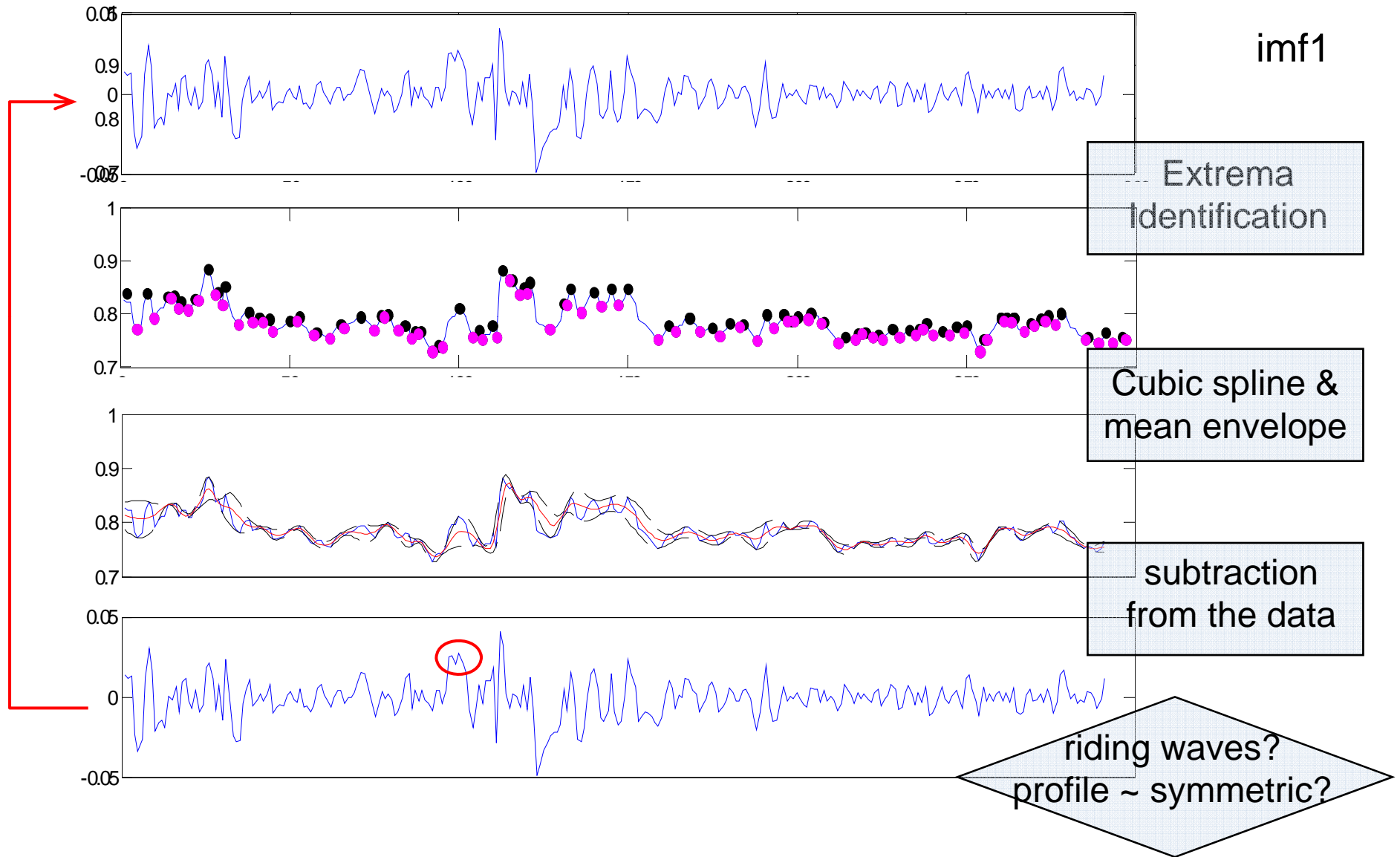
Operator-independent identification of time scales

Physical meaning?



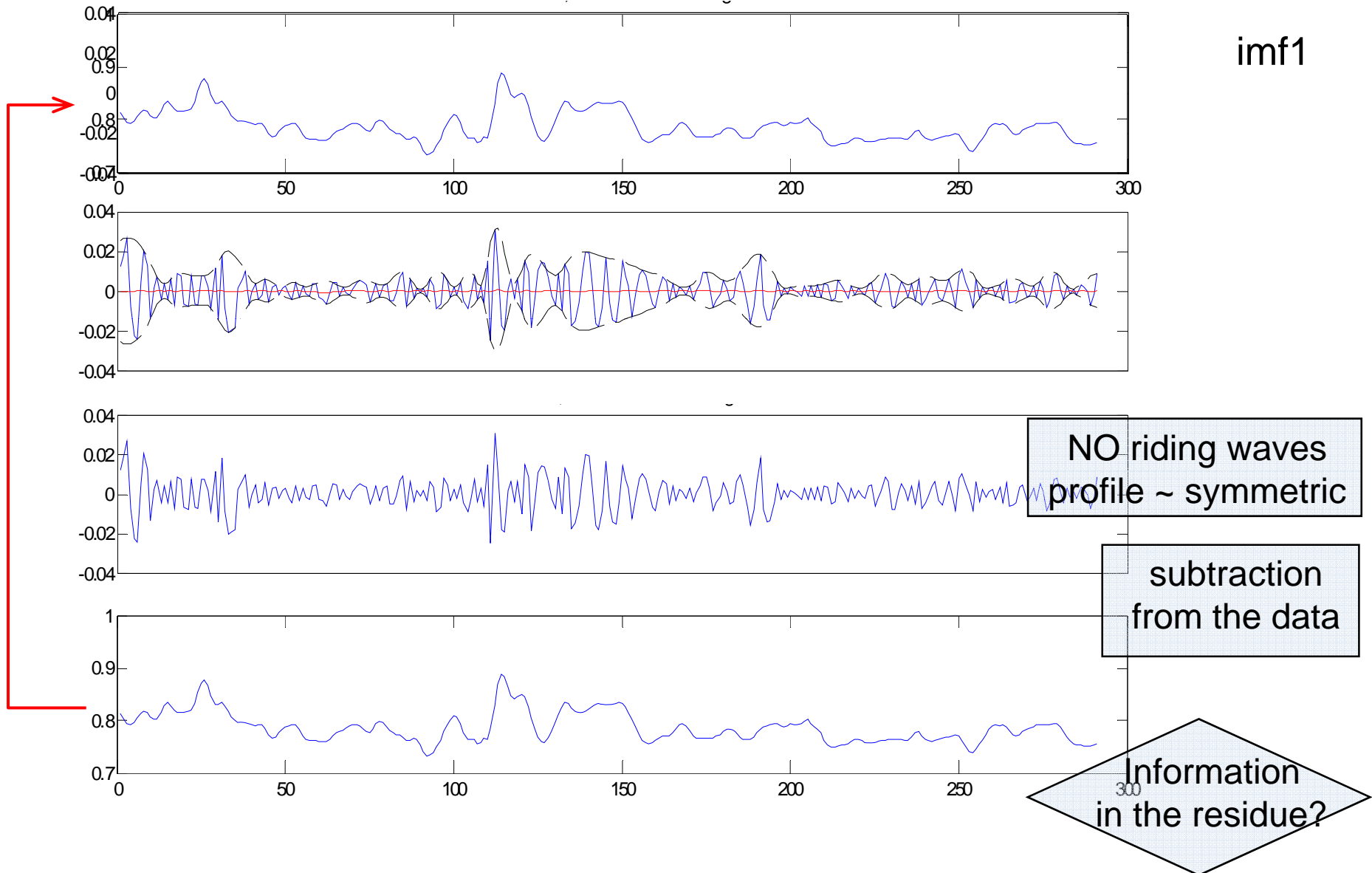


Methods: Empirical mode decomposition (2)





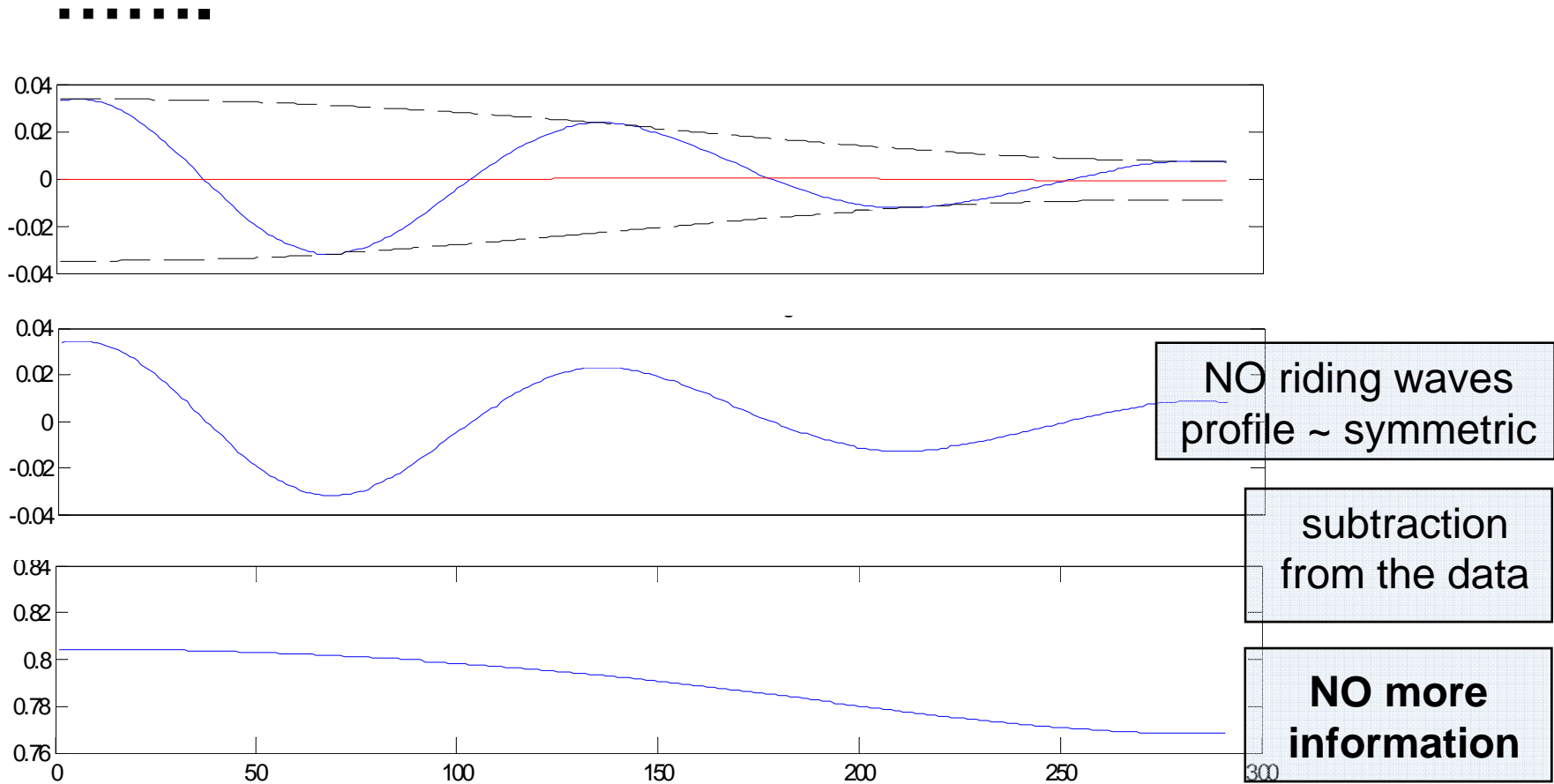
Methods: Empirical mode decomposition (2)





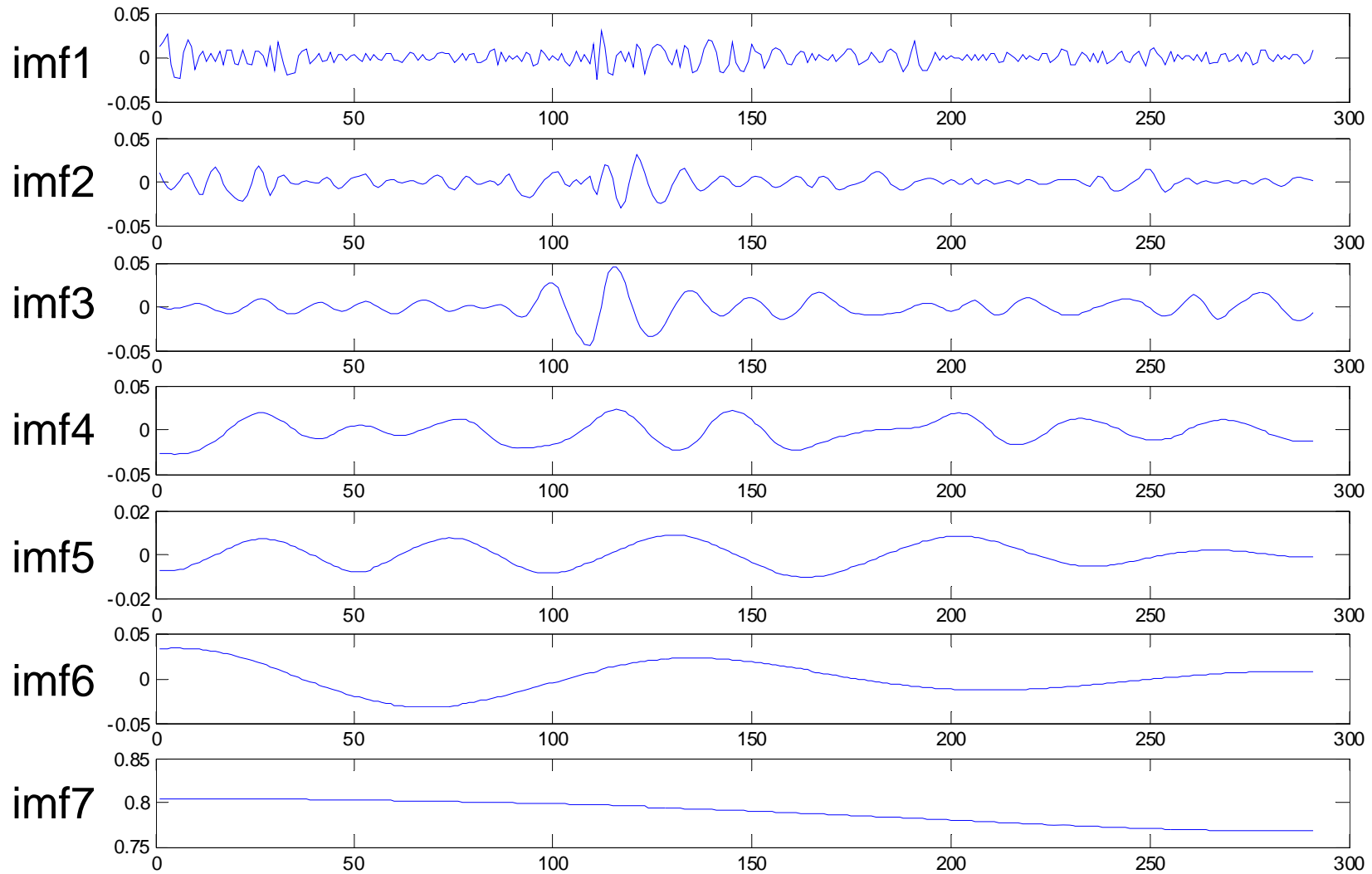
Methods: Empirical mode decomposition (2)

imf6





Methods: Empirical mode decomposition (2)



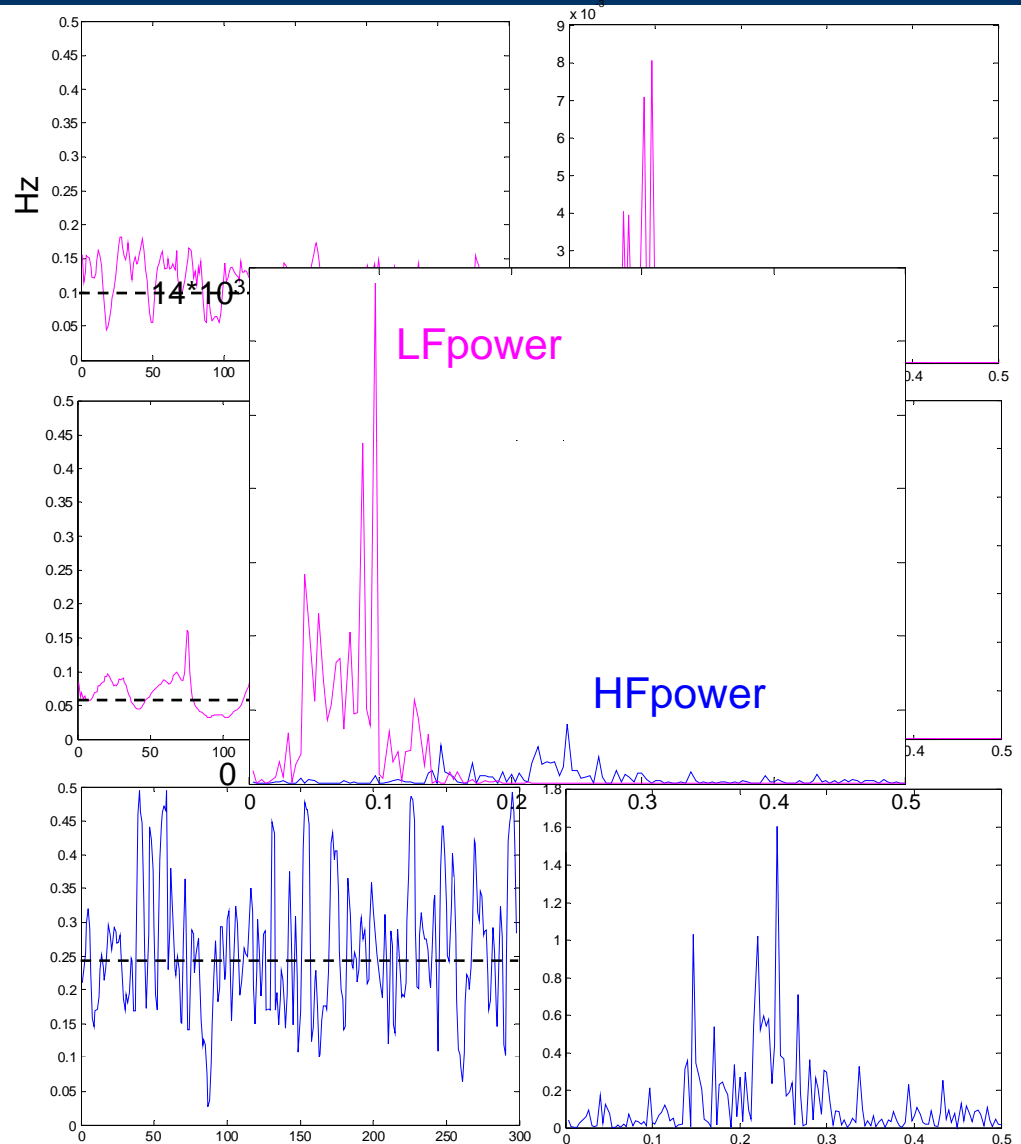


Methods: EMD - Parameters Extraction (1)

LF1: First mode with characteristic frequency closest to 0.1 Hz

LF2: First mode with characteristic frequency lower than LF1 (LF band?)

HF*i*: Modes with characteristic frequencies greater than LF1





Methods: Local non-linear prediction

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Definition:

Patterns with similar past values have close future values

Hypotesis:

\exists a continuous function:

$$x(i+1) = f(x_L(i))$$

$$x_L(i) = (x(i), x(i-\tau), \dots, x(i-(L-1)\tau))$$

The continuity guarantees that: if $x_L(i), x_L(j)$ are close

$\Rightarrow x(i+1), x(j+1)$ will be close

Patterns similarity criterion?

$x_L(j)$ is close to $x_L(i)$ if $x_L(j)$ stays in the same finite region of the phase space that contains $x_L(i)$

\Rightarrow The estimated function can be used to predict future values

Local Approximation technique:

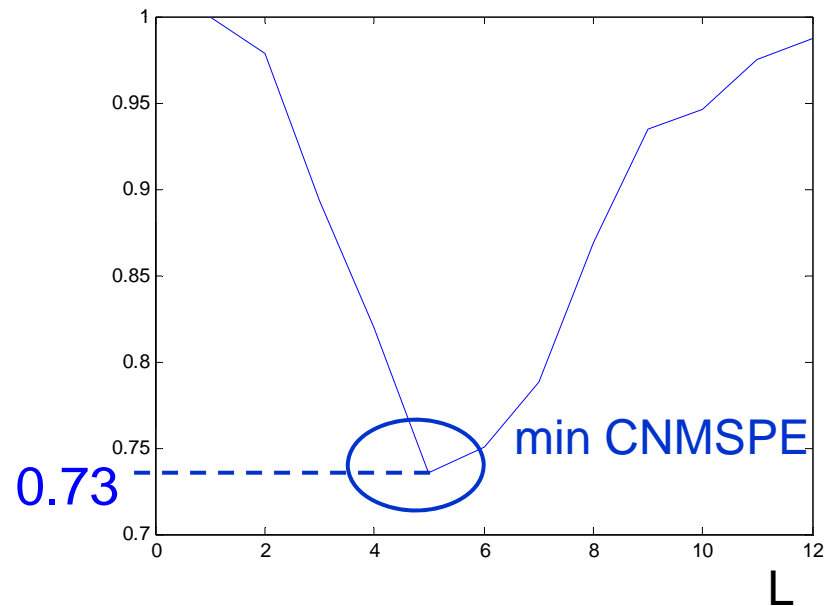
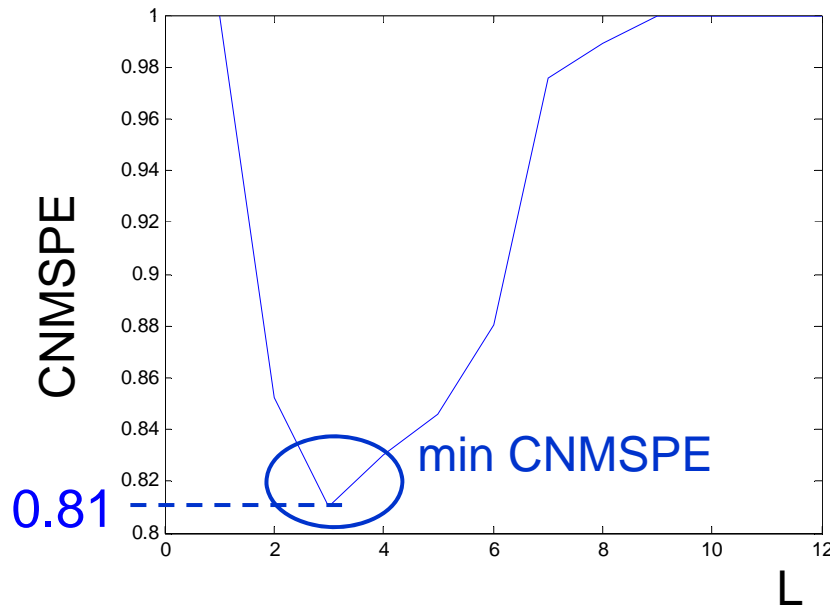
$$\hat{x}_L(i+1/L) = \hat{f}(x_L(i))$$



Methods: Local non-linear prediction

Cost function for Evaluating Prediction:

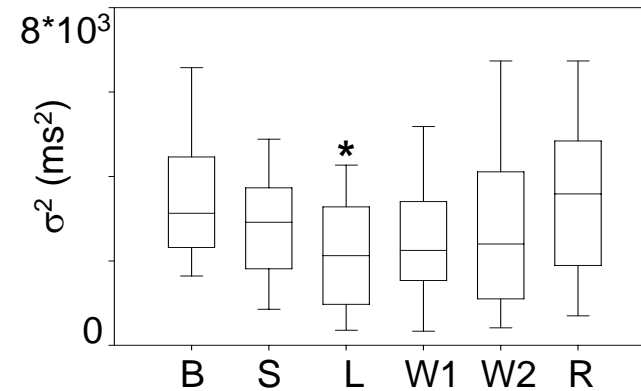
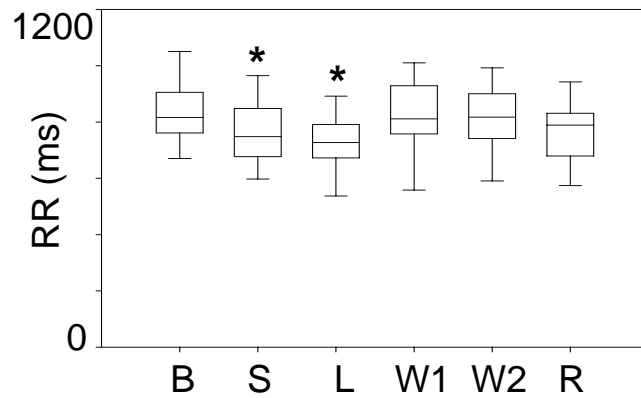
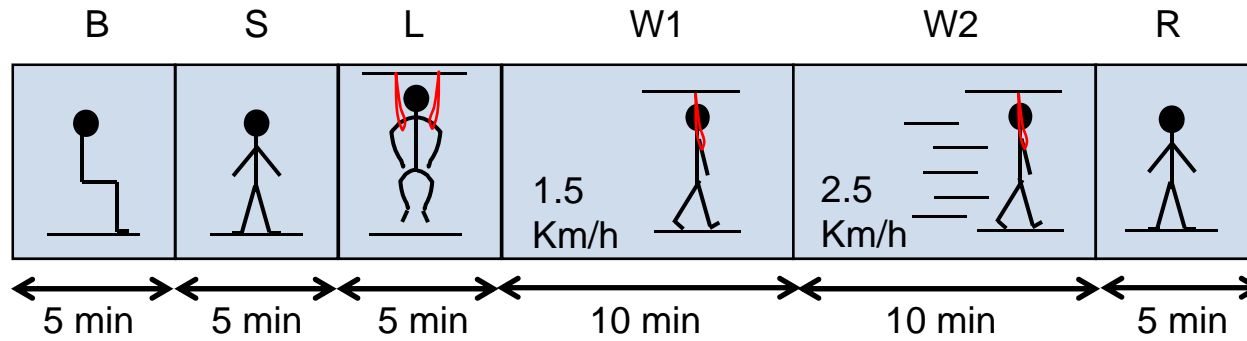
- $\hat{f}()$ → Prediction error $e(i/L-1) = x(i) - \hat{x}(i/L-1)$
- Normalized Mean Squared prediction error
- correction to avoid the “ perfect prediction” effect ($L \uparrow$)



$$UPI = \min(CNMSPE(L))$$



Results: Normal Subjects: Protocol #1



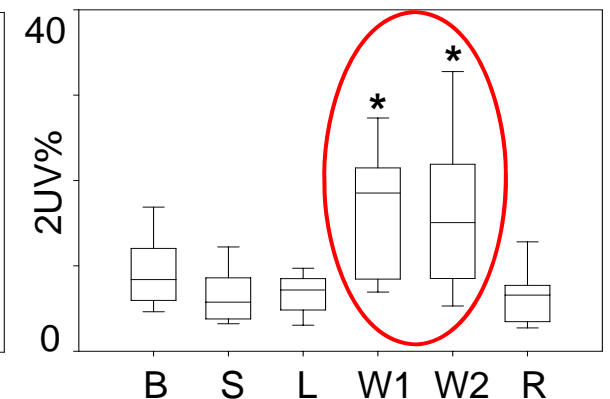
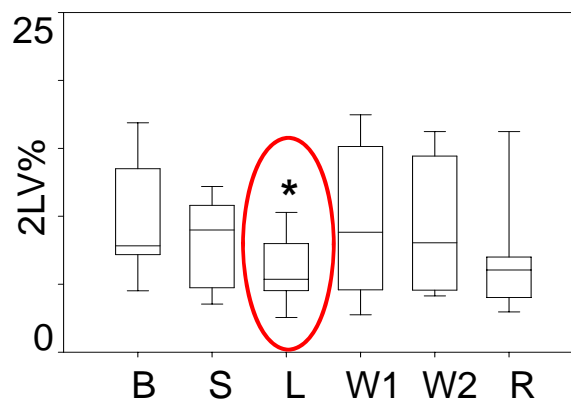
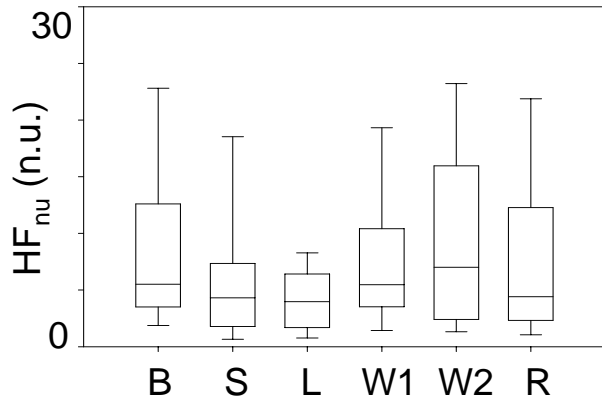
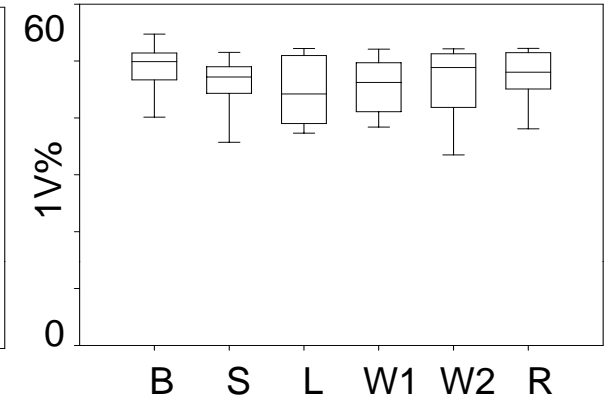
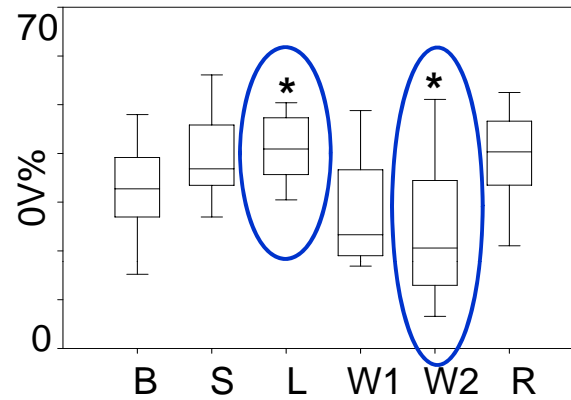
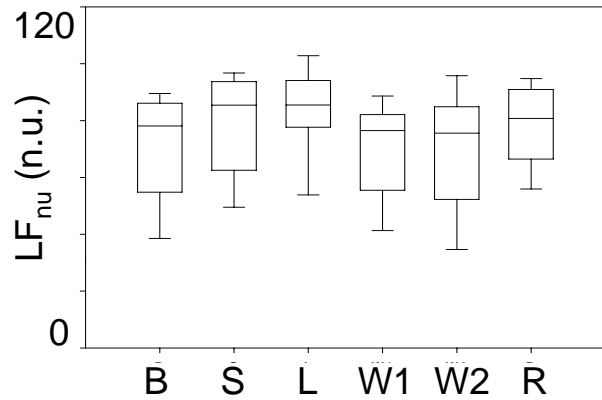
* $p < 0.05$ vs B



Results: Normal Subjects: Protocol #1

Spectral Analysis

Symbolic Analysis

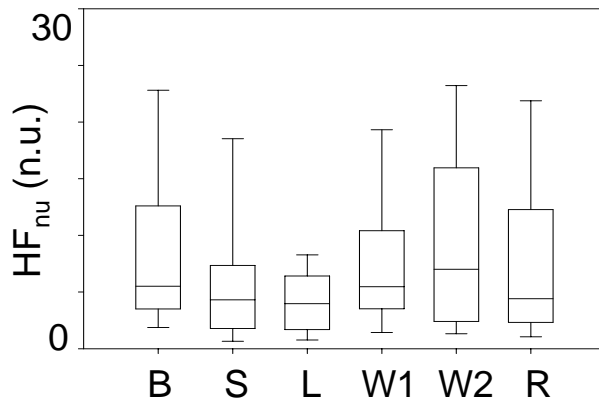
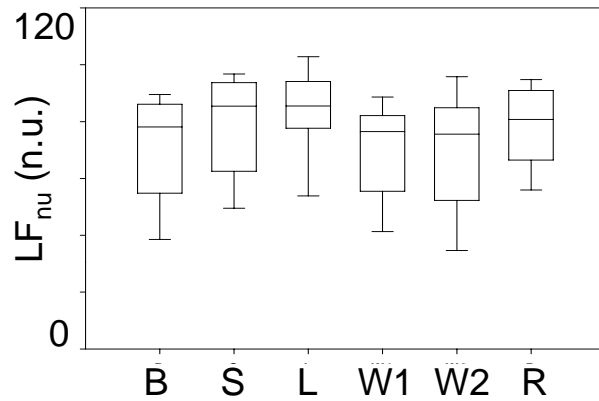


* p < 0.05 vs B

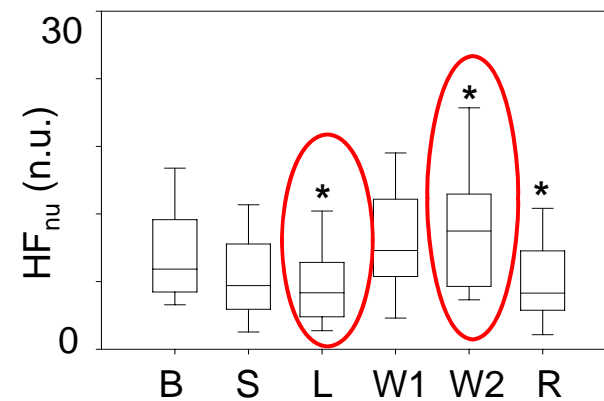
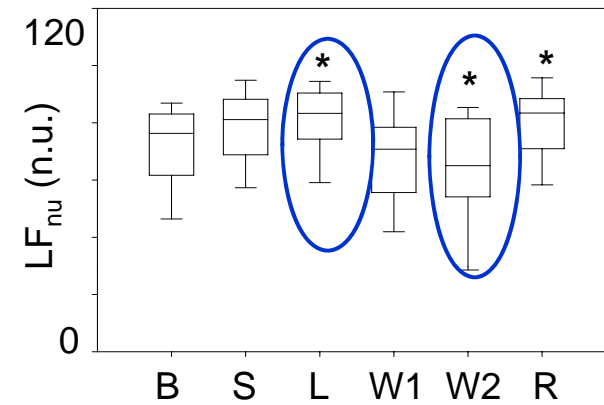


Results: Normal Subjects: Protocol #1

Spectral Analysis



EMD Analysis

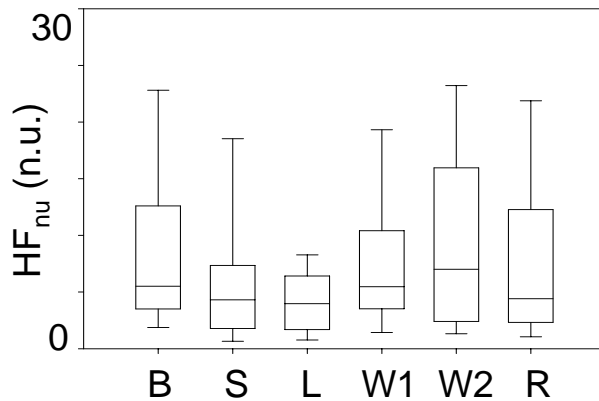
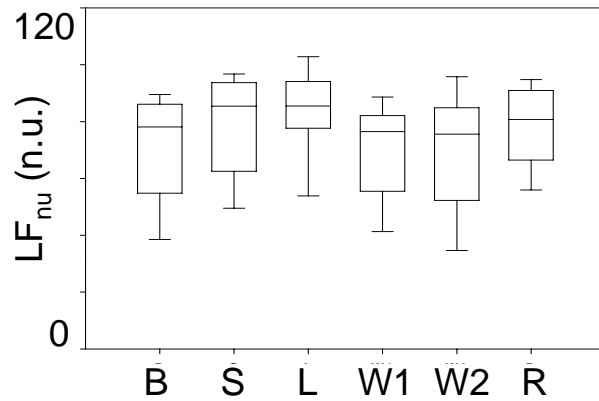


* p < 0.05 vs B

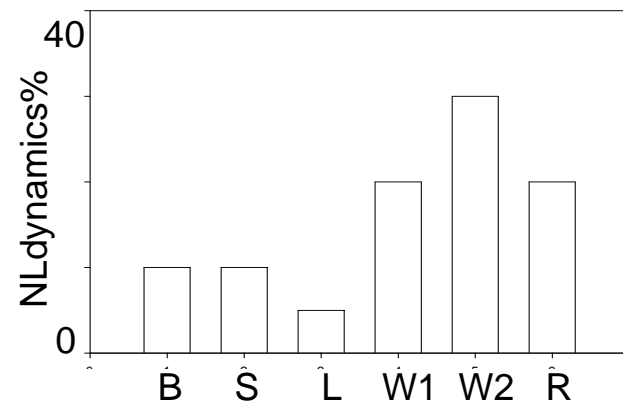
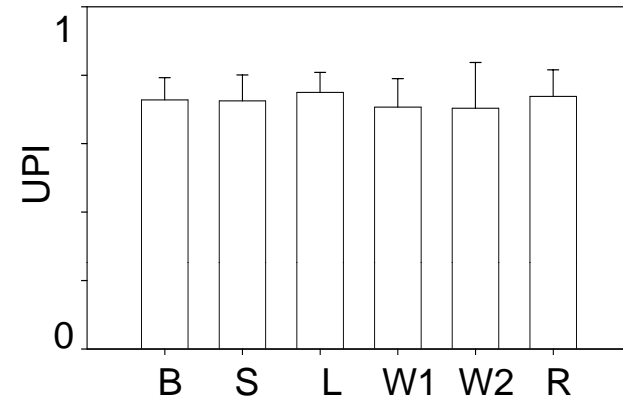


Results: Normal Subjects: Protocol #1

Spectral Analysis



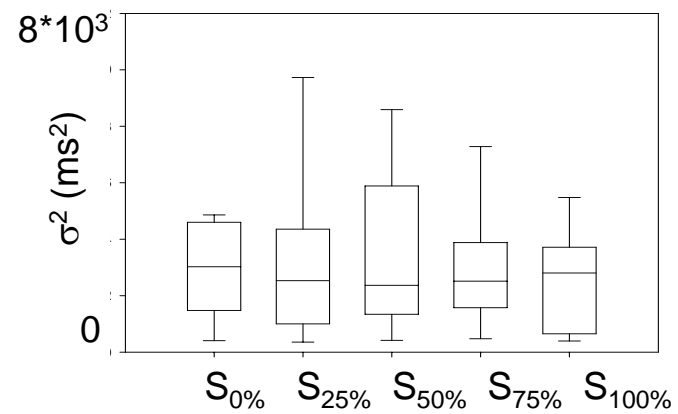
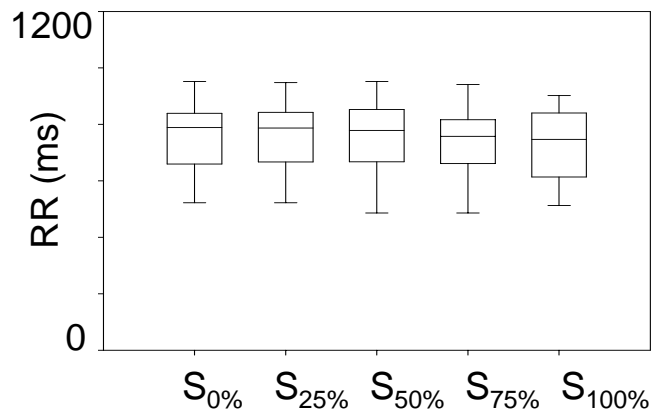
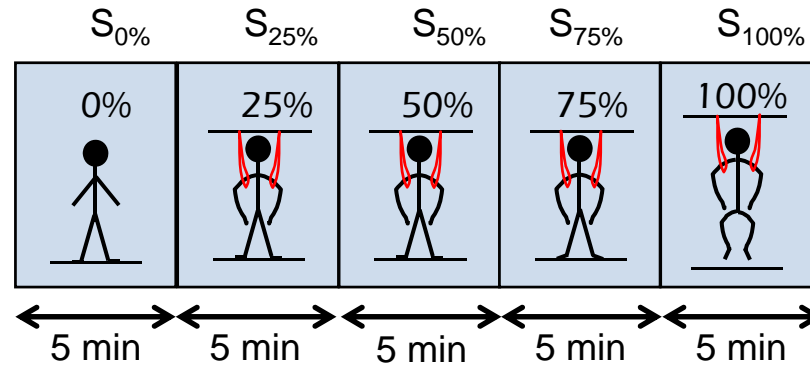
Complexity Analysis



* p<0.05 vs B



Results: Normal Subjects: Protocol #2

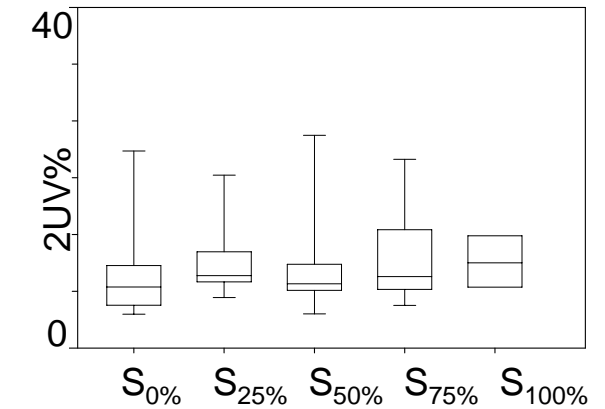
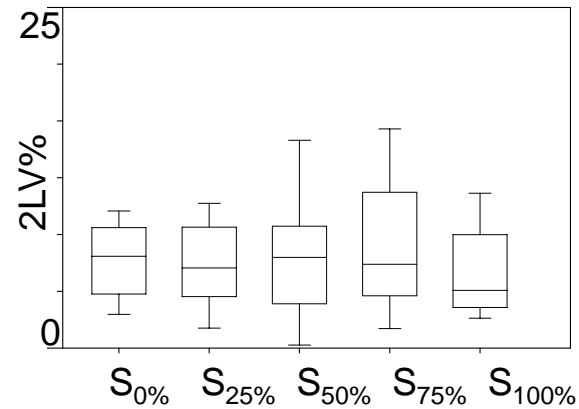
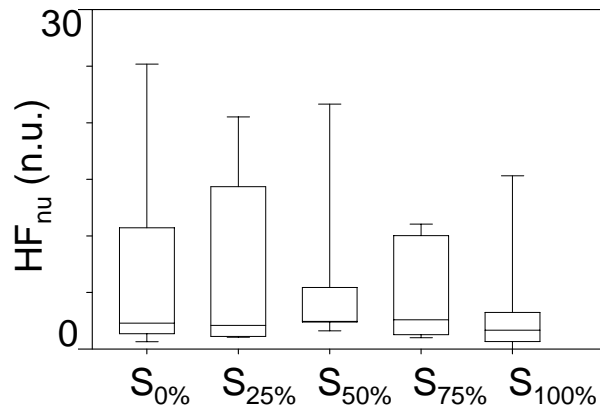
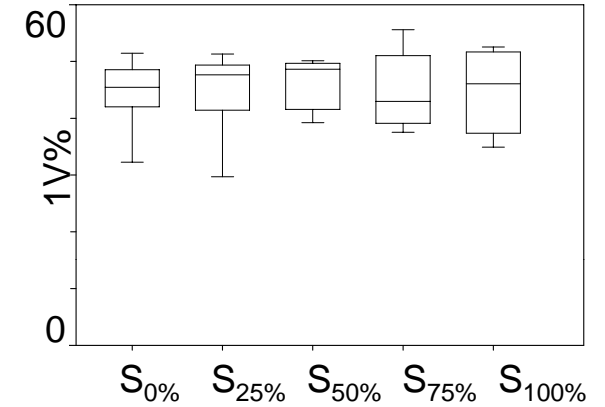
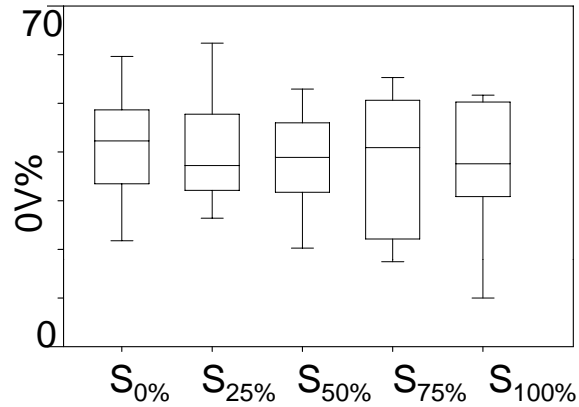
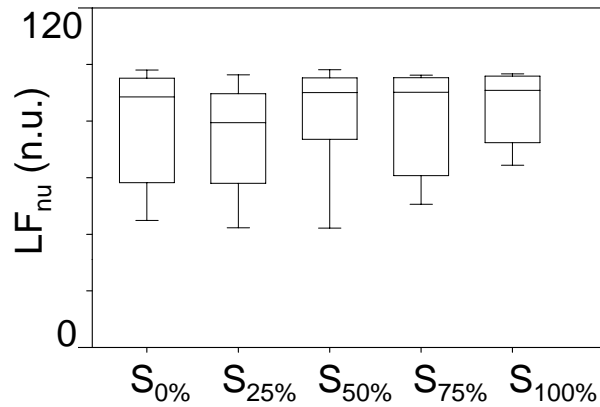




Results: Normal Subjects: Protocol #2

Spectral Analysis

Symbolic Analysis

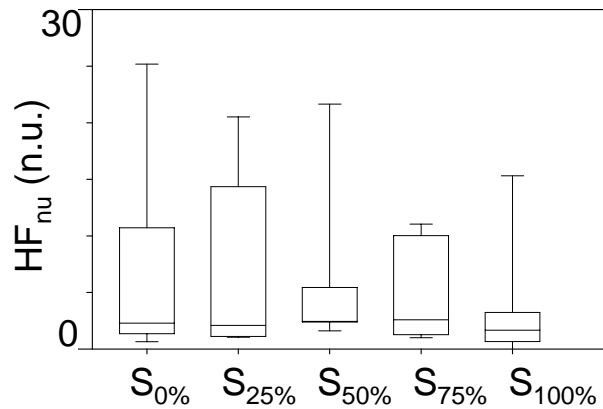
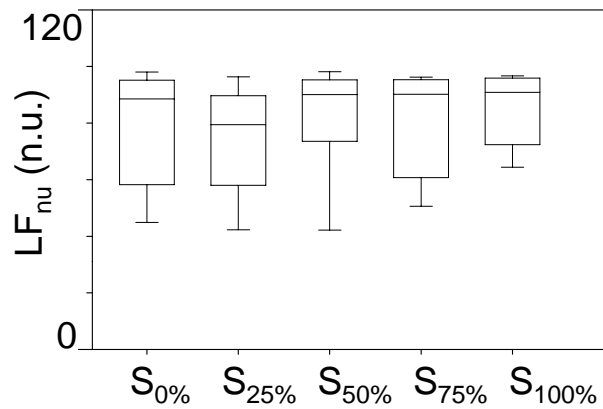




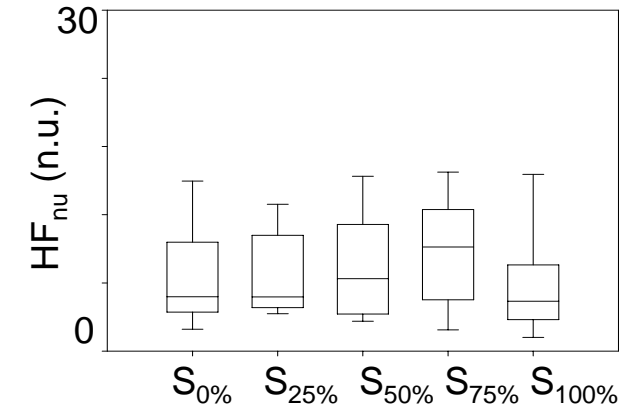
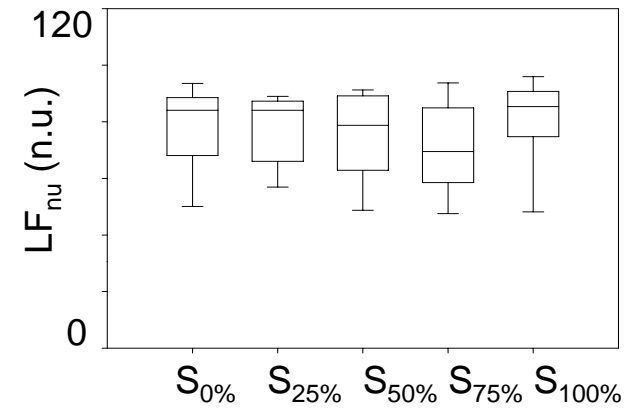
Results:

Normal Subjects: Protocol #2

Spectral Analysis



EMD Analysis

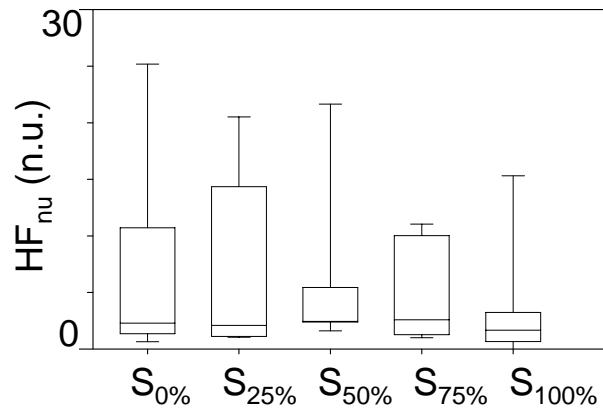
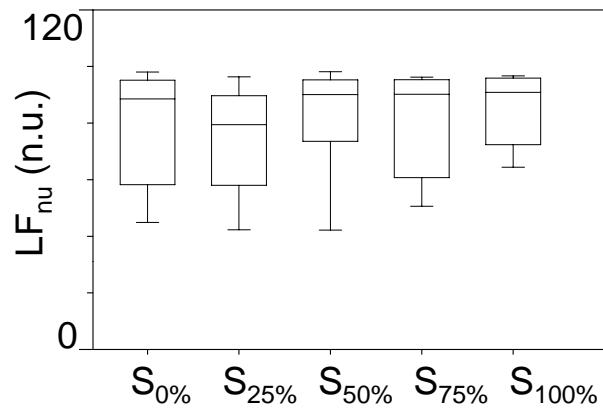




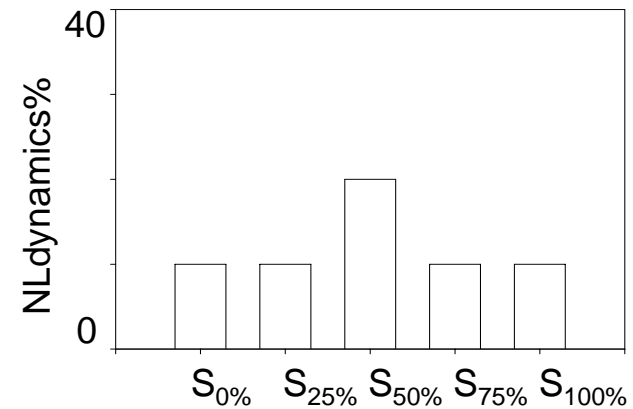
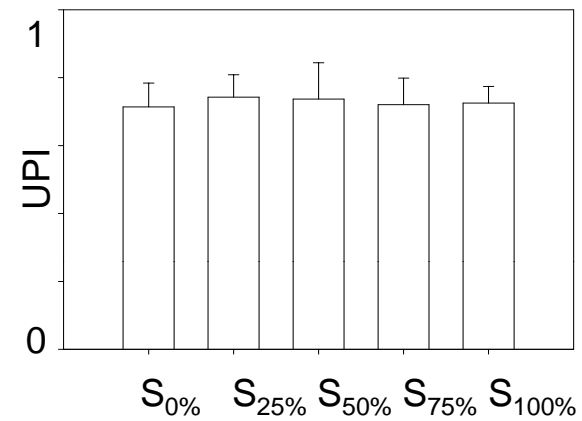
Results:

Normal Subjects: Protocol #2

Spectral Analysis

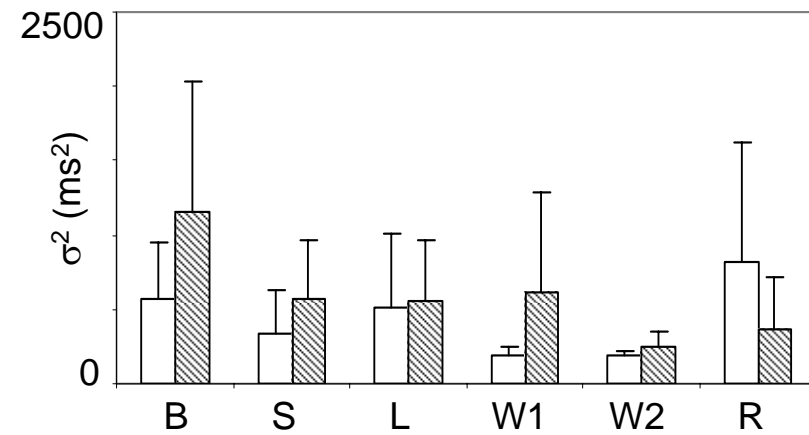
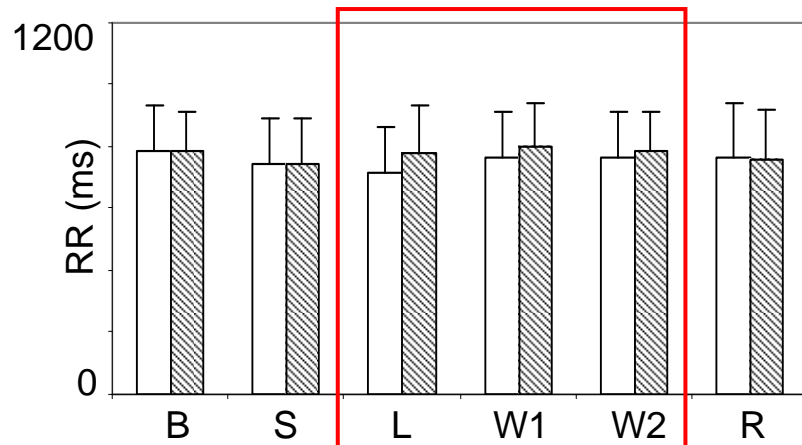
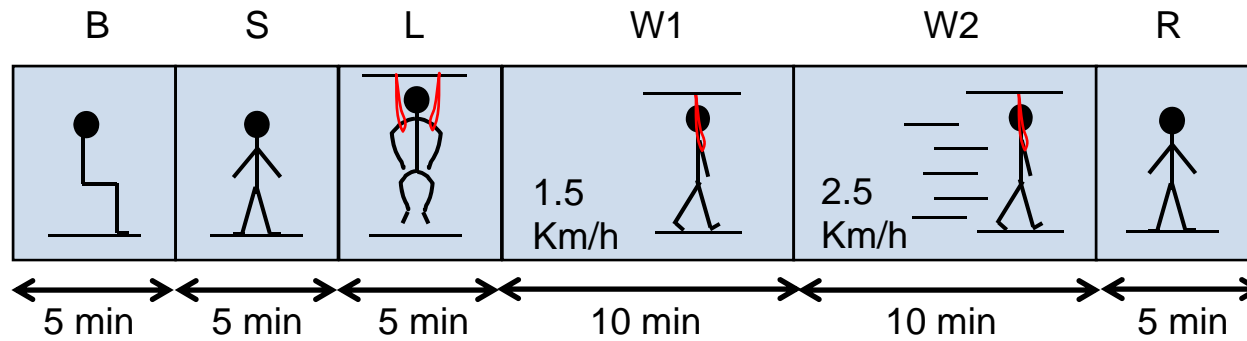


Complexity Analysis





Results: Subjects after Stroke

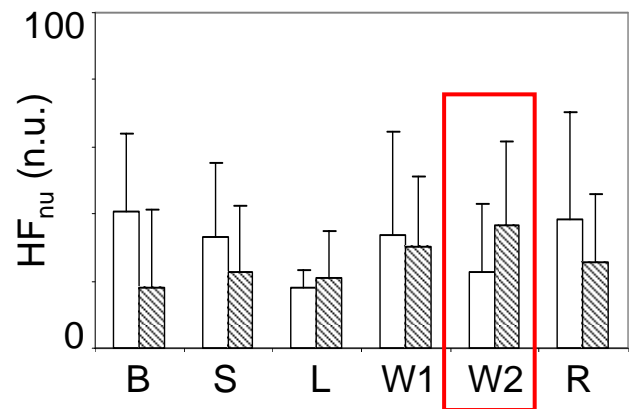
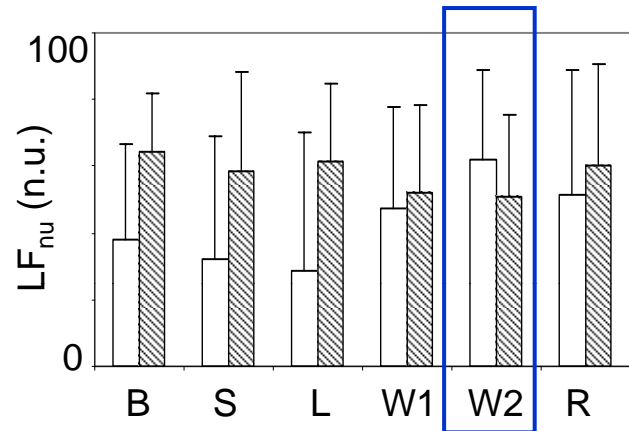


- First Lokomat treatment
- ▨ Last Lokomat treatment

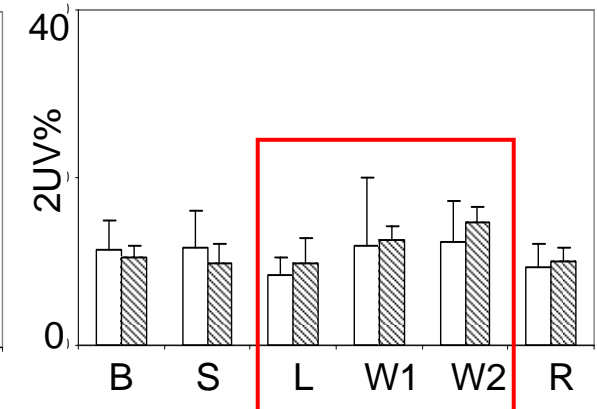
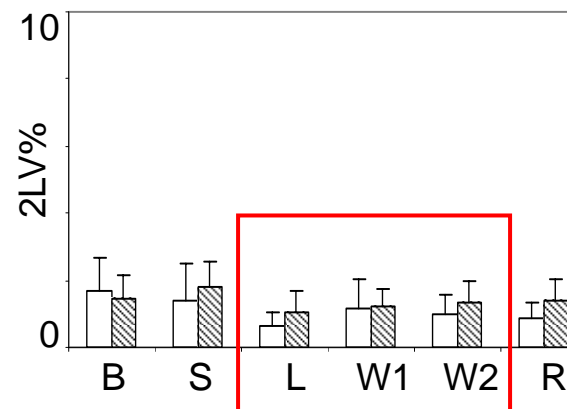
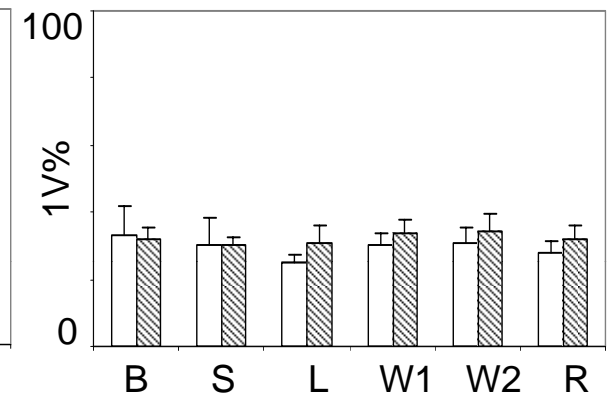
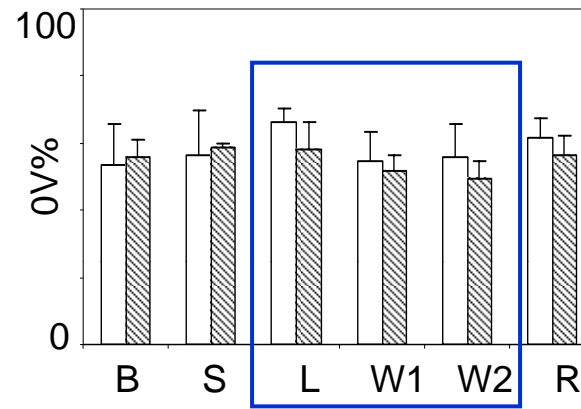


Results: Subjects after Stroke

Spectral Analysis



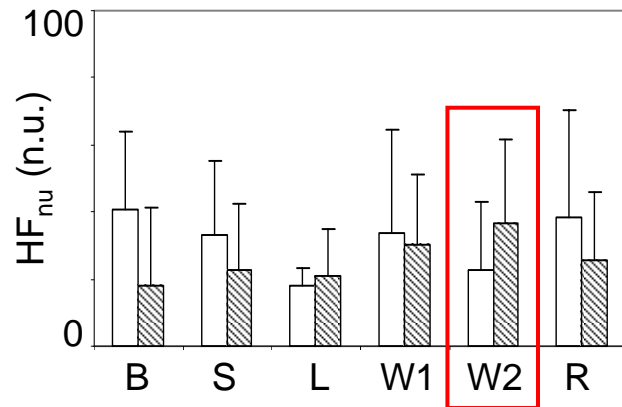
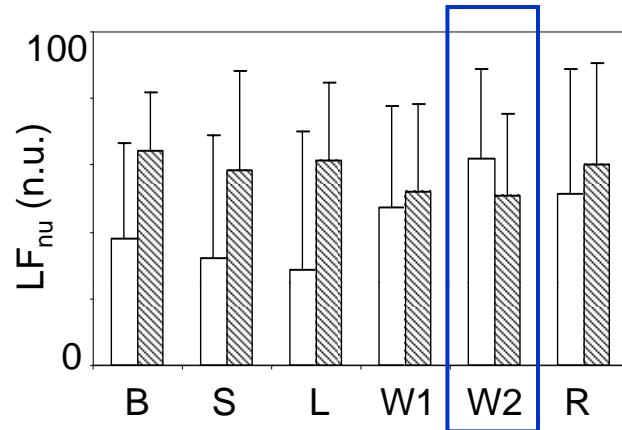
Symbolic Analysis



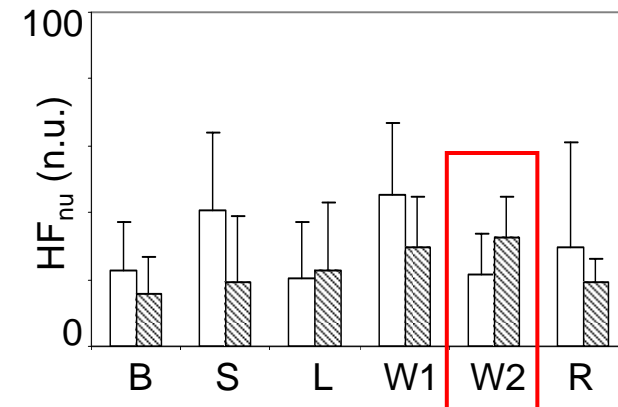
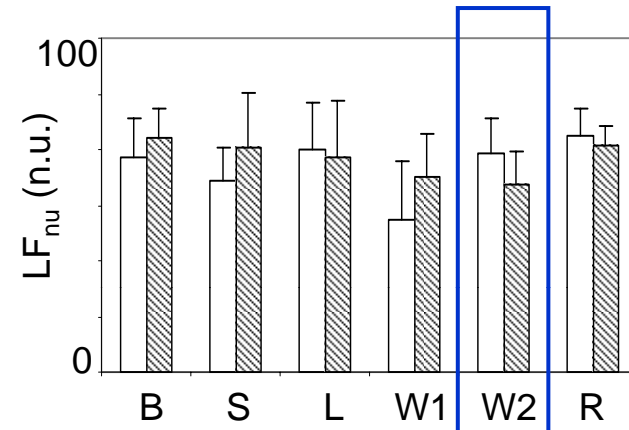


Results: Subjects after Stroke

Spectral Analysis



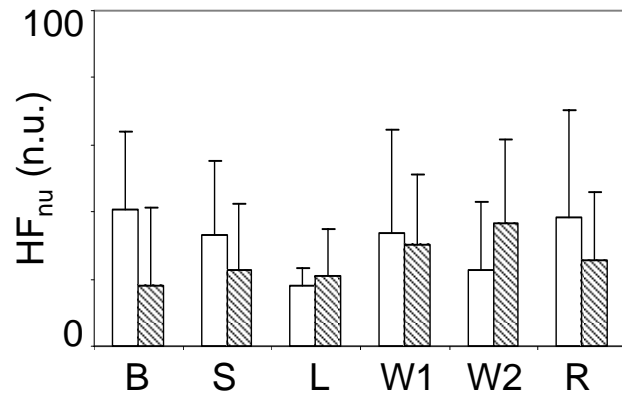
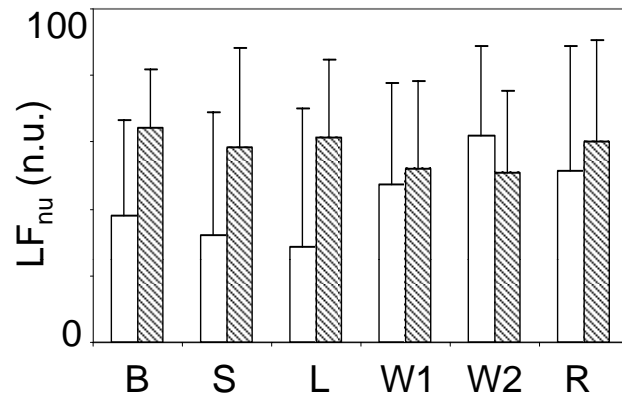
EMD Analysis



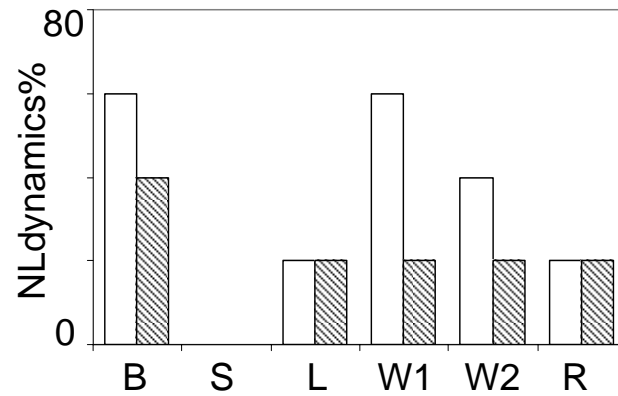
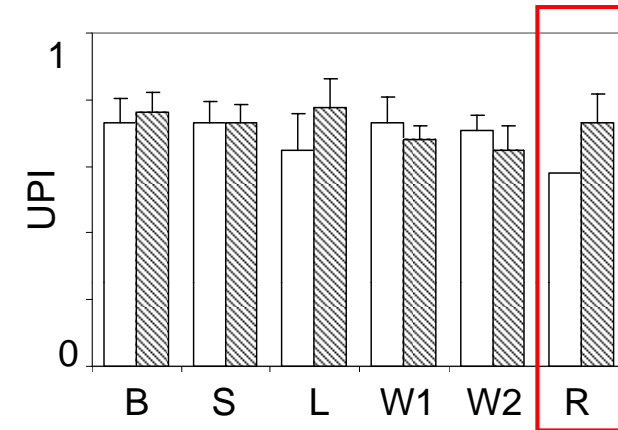


Results: Subjects after Stroke

Spectral Analysis



Complexity Analysis





Exercise protocol:

33

12 healthy subjects

Data Acquisition:

ECG & respiratory signals

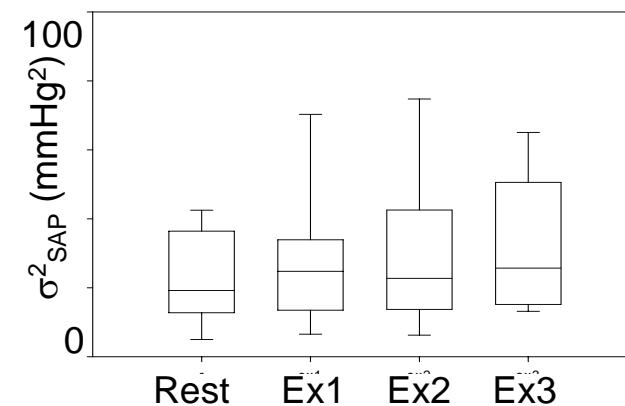
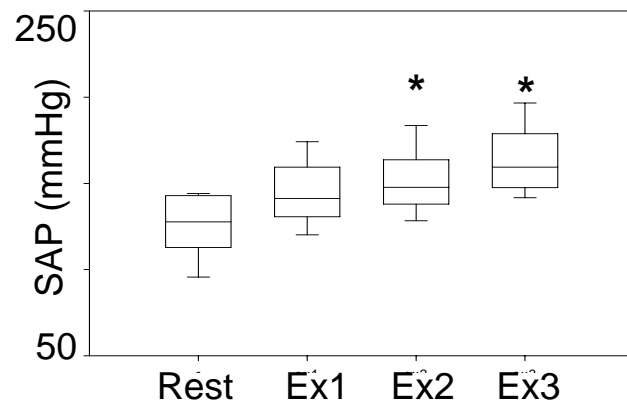
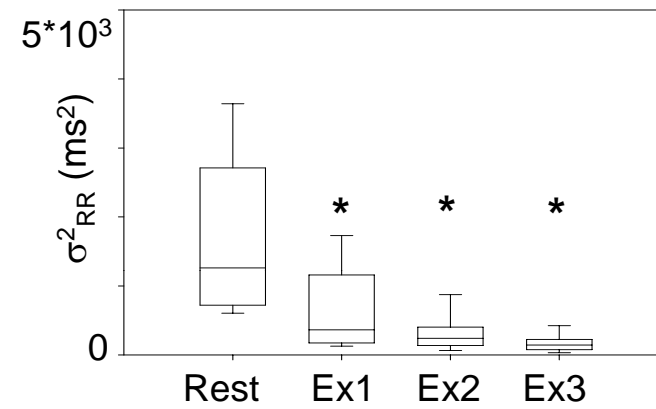
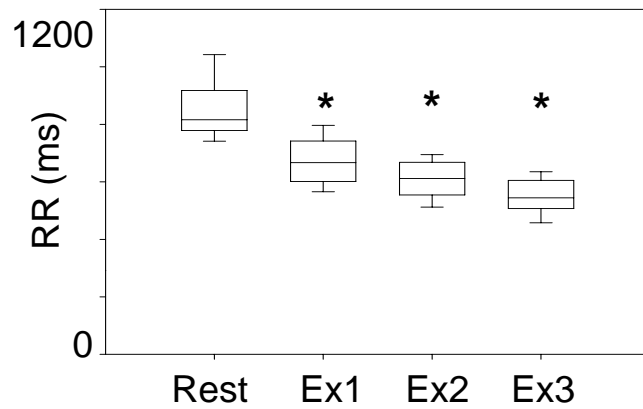
Arterial pressure (non invasive)

Experimental Protocol:

- Rest → 10 min baseline recording (supine)
 - Three-step progressive supine bicycle exercise
 - Ex1 → 10%
 - Ex2 → 20%
 - Ex3 → 30%
- } nominal maximum exercise



Results: Exercise protocol

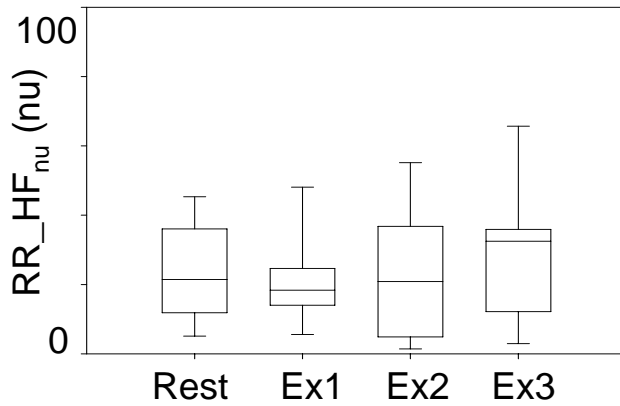
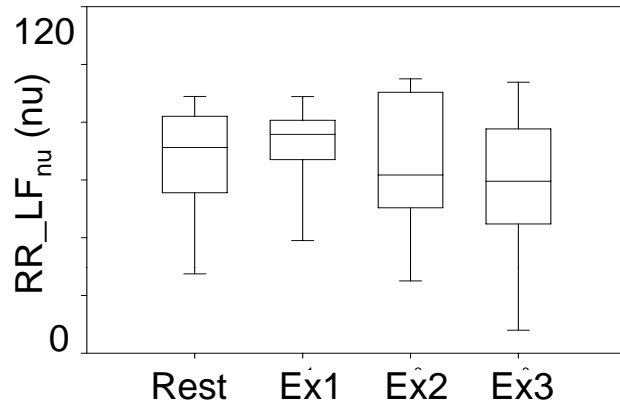


* p<0.05 vs rest

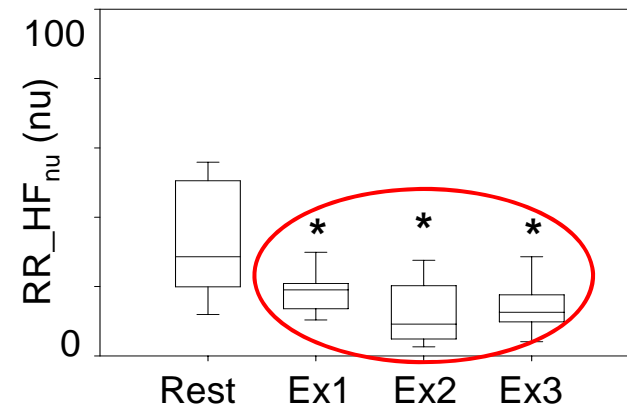
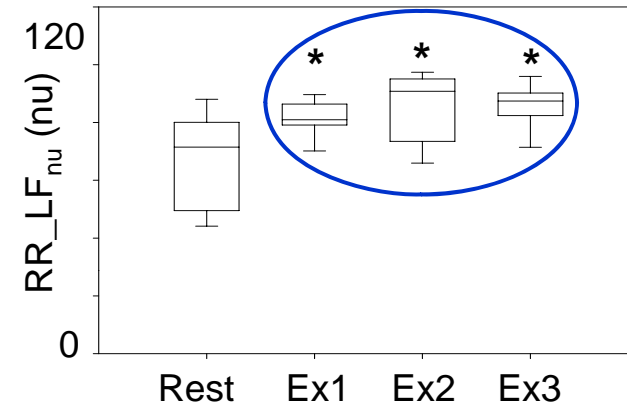


Results - RR: Exercise protocol

Spectral Analysis



EMD Analysis

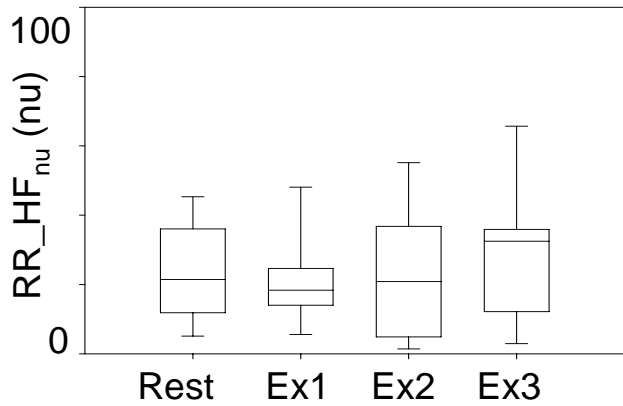
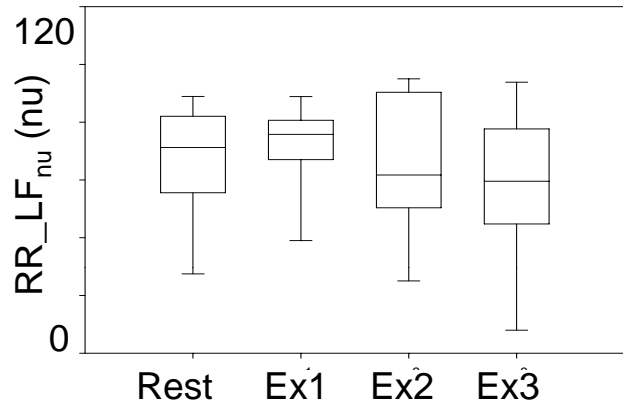


* p < 0.05 vs rest

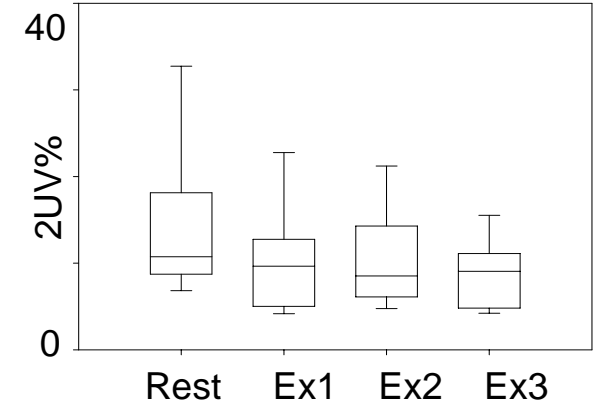
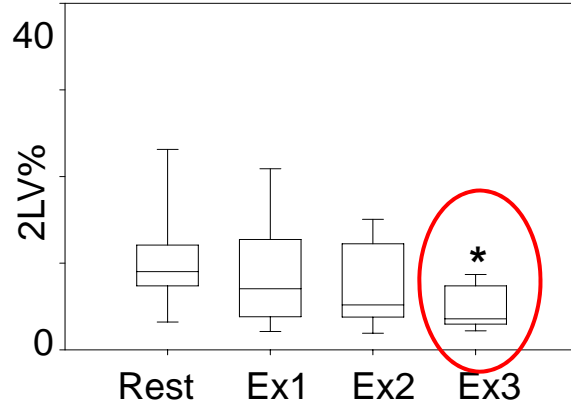
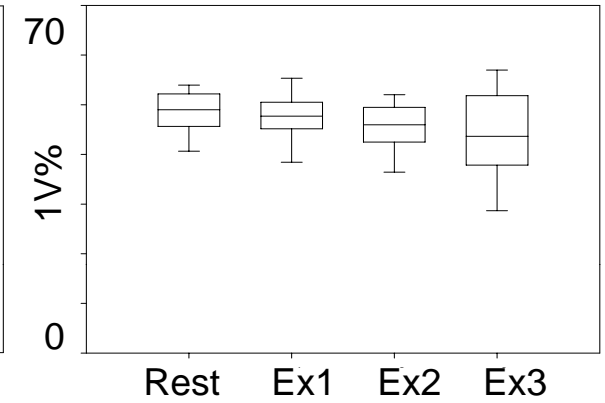
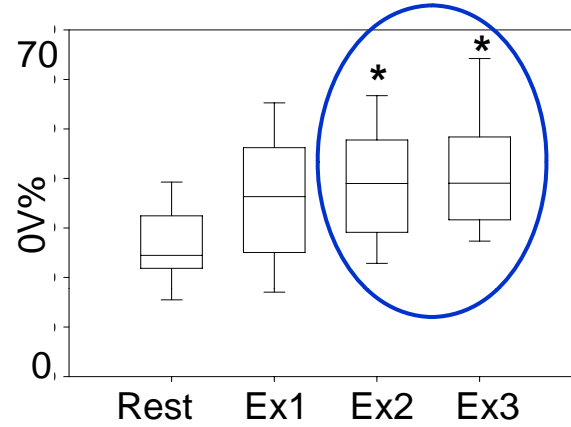


Results - RR: Exercise protocol

Spectral Analysis



Symbolic Analysis

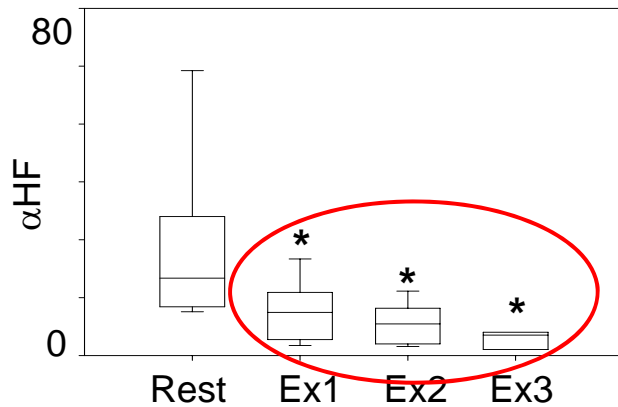
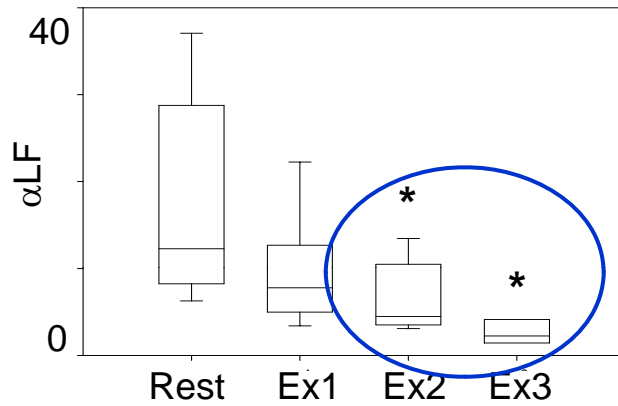


* $p < 0.05$ vs rest

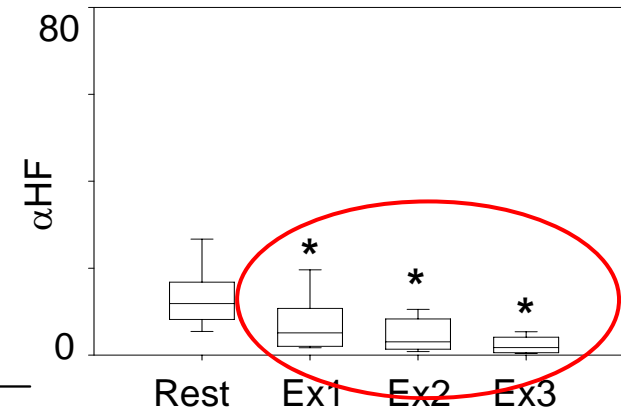
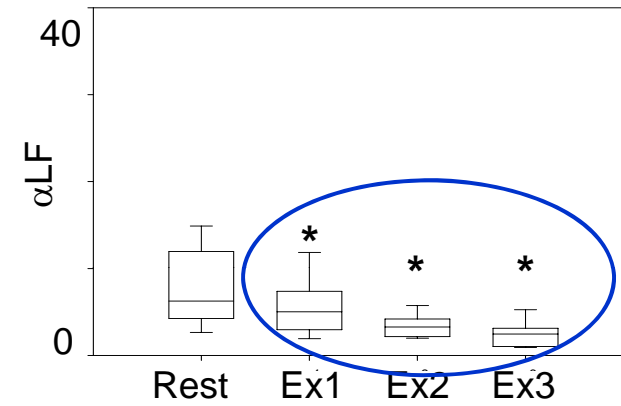


Results – Baroreflex Gain: Exercise protocol

Spectral Analysis



EMD Analysis



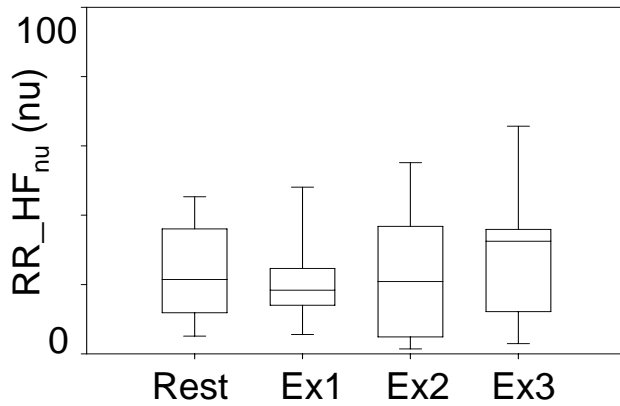
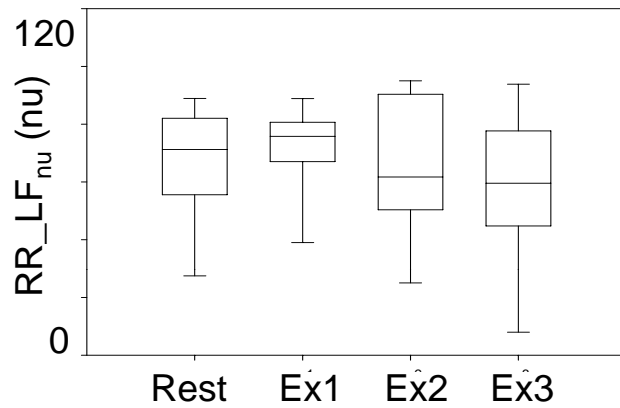
$$\alpha_{LF} = \sqrt{\frac{P_{rr(LF)}}{P_{sap(LF)}}}$$

* $p < 0.05$ vs rest

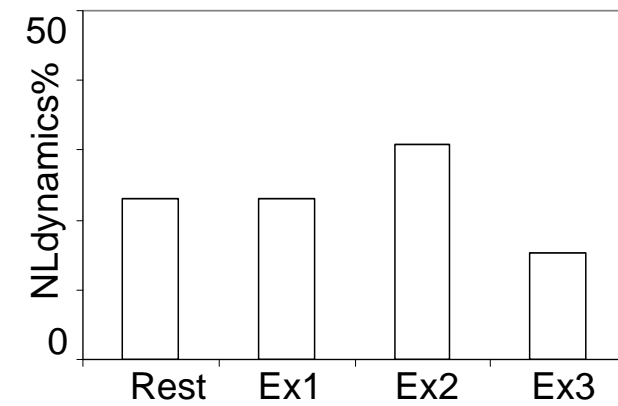
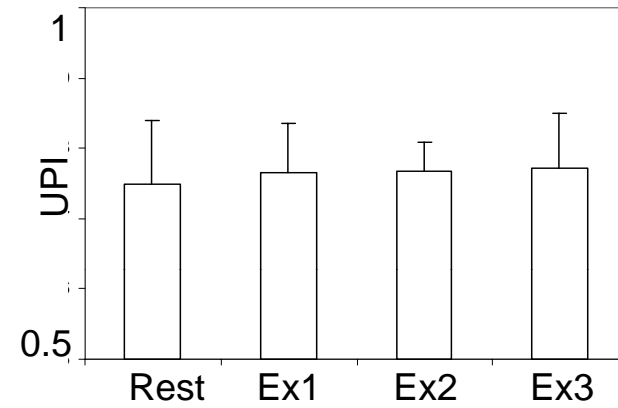


Results - RR: Exercise protocol

Spectral Analysis



Complexity Analysis





Robotic Assisted treadmill Training

No significant sympathetic activity increases

Improved autonomic control after treatment (! 5 subjects)

? Correlation between Cardiovascular & Locomotor parameters

- Gait Analysis
- Motor scores



Light Cycloergometer Exercise

Baroreflex sequence analysis: Original RR & SAP series VS EMD results

? EMD as a Filter

