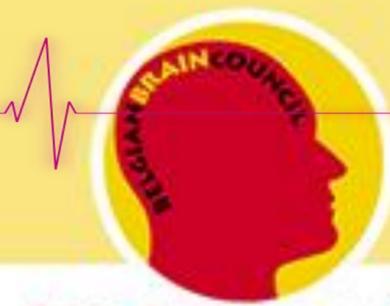


# A Heartbeat Away From Consciousness: Heart Rate Entropy can assess Consciousness

*Francesco Riganello<sup>1,2\*</sup>, Stephen Karl Larroque<sup>1\*</sup>, Mohamed Ali Bahri<sup>3</sup>, Lizette Heine<sup>4</sup>, Charlotte Martial<sup>1</sup>, Manon Carrière<sup>1</sup>, Vanessa Charland-Verville<sup>1</sup>, Charlène Aubinet<sup>1</sup>, Audrey Vanhauzenhuysse<sup>5</sup>, Camille Chatelle<sup>1</sup>, Steven Laureys<sup>1</sup> and Carol Di Perri<sup>1,6</sup>*

<sup>1</sup> Coma Science Group, GIGA-Consciousness, University & Hospital of Liege, Belgium ; <sup>2</sup> Research in Advanced NeuroRehabilitation, Istituto S. Anna, Crotone, Italy ; <sup>3</sup> GIGA-Cyclotron Research Center In Vivo Imaging, University of Liege, Belgium ; <sup>4</sup> Centre de Recherche en Neurosciences, Inserm U1028 - CNRS UMR5292, University of Lyon 1, France ; <sup>5</sup> Sensation & Perception research Group, GIGA-Consciousness, University & Hospital of Liege, Belgium ; <sup>6</sup> Centre for Clinical Brain Sciences, University of Edinburgh, Edinburgh, UK ; \* These authors contributed equally to this work.

[stephen.larroque@uliege.be](mailto:stephen.larroque@uliege.be)



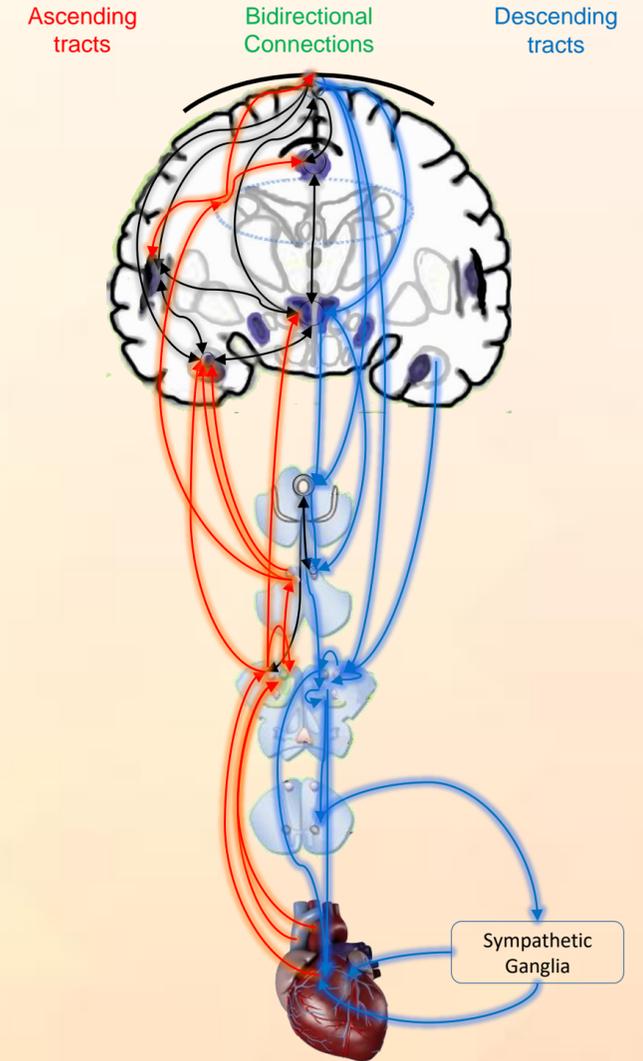
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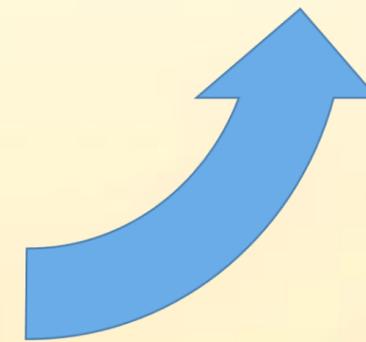
# Diagnosing consciousness?



Neuroimaging helps, but is expensive and difficult in daily clinical setting



Healthcare differs if patient is **unresponsive (UWS)** or **minimally conscious (MCS)**

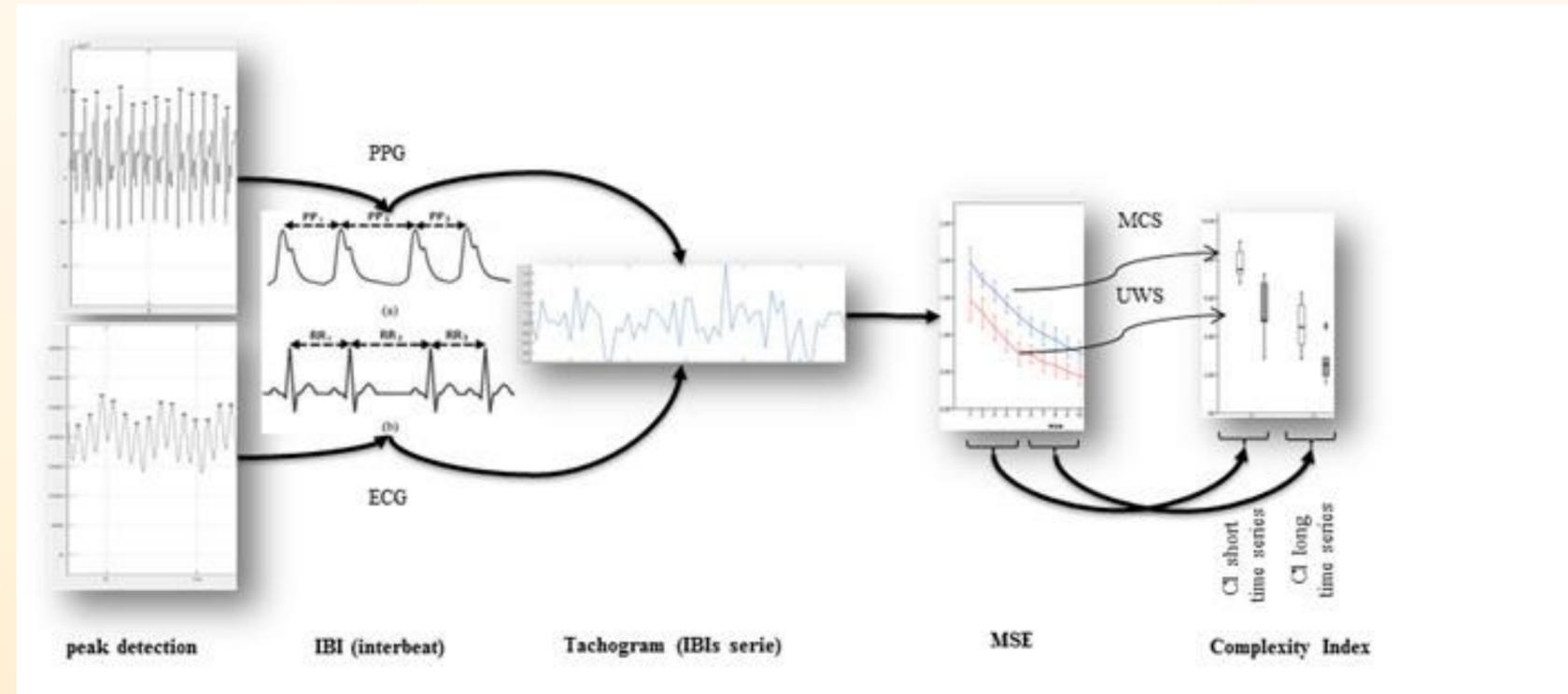


**~35% clinical diagnosis error** which can impact life and death decisions

→ Can we better diagnose by monitoring the heart?

# Methods – from heart rate to complexity index

From heart rate to multi-scale entropy to **COMPLEXITY INDEX** in the short term ( $CI_s$ ) and long term ( $CI_l$ ):



- 14 UWS & 16 MCS (n=30) sedated patients, assessed by Coma Recovery Scale – Revised (CRS-R).
- Matched for age, gender and onset.
- Electrocardiographic activity (ECG) and photoplethysmographic sensor (PPG) acquired for 10 minutes, simultaneously with MRI (3T Siemens Magnetom TrioTim).
- PPG and ECG cleaned with a Fourier Transform (SigView software).
- CI = area under the sample entropy timescale curve over multi-scale entropy (HRV Advanced Analysis software v2.2).
- MRI T1 and EPI BOLD (n=21) preprocessed with SPM12 and 2<sup>nd</sup>-level correlation analyses with CONN 17f with  $CI_s$  &  $CI_l$  as covariates of interest in a parametric regression.

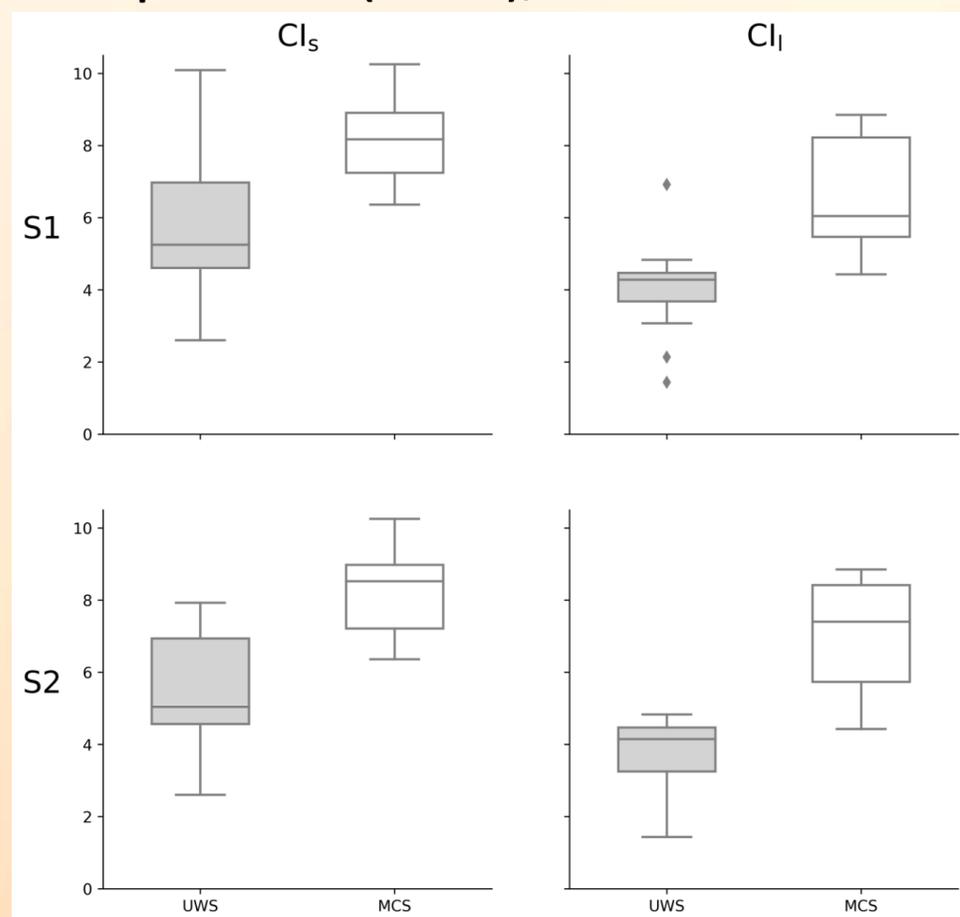
# Results

(Riganello & Larroque, 2018)

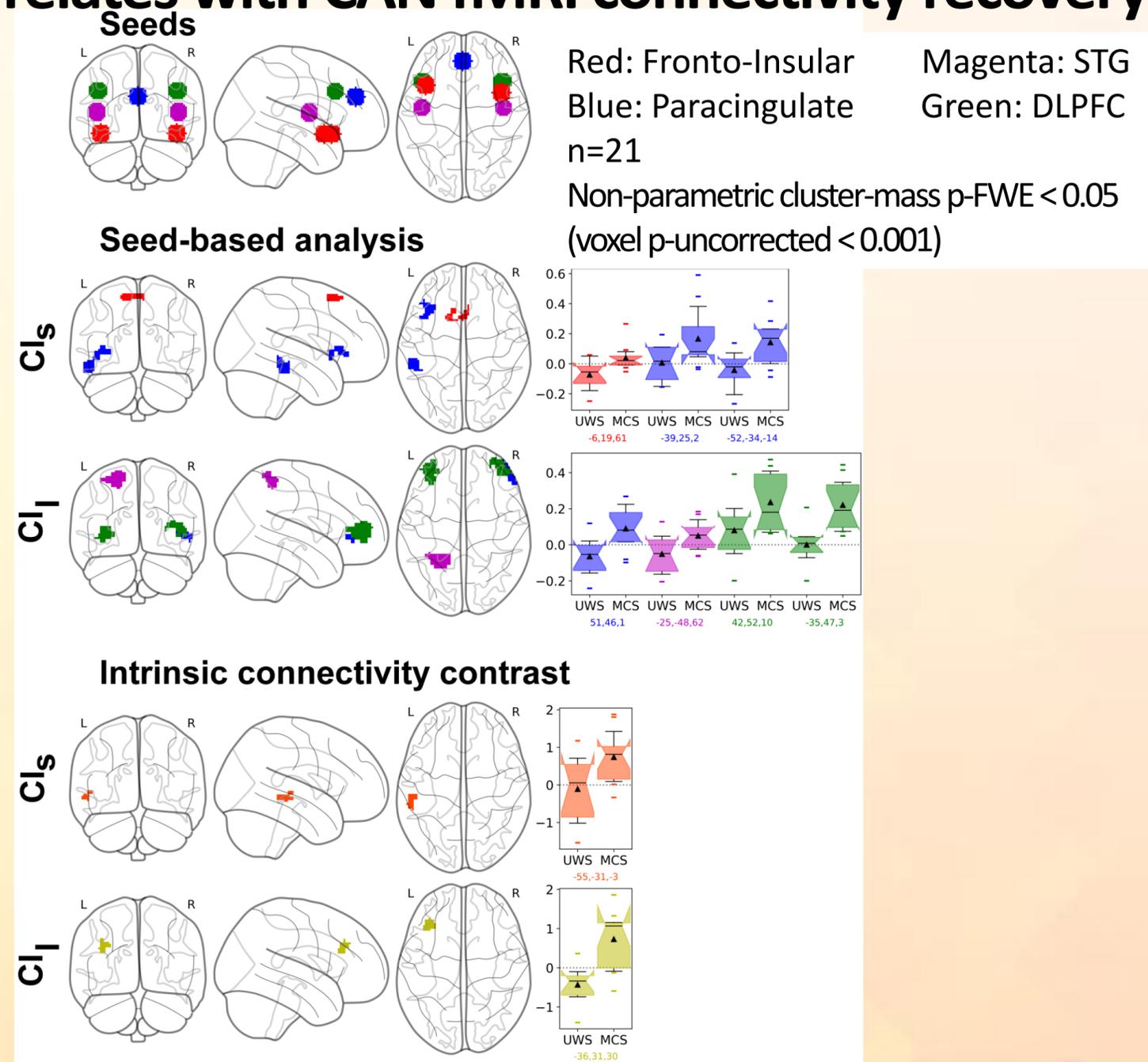
**MCS have higher CI than UWS on average**

$CI_s$  ( $z=-3.346$ ,  $p<0.001$ ) and  $CI_l$  ( $z=-4.095$ ,  $p<0.0001$ ) using a Mann-Whitney's test.

S1 includes all patients ( $n=30$ ), S2 fMRI included ( $n=21$ )



**CI correlates with CAN fMRI connectivity recovery**



# Results

&

# Conclusion

## CI reliably discriminates MCS from UWS

Using a One-R classifier with 10-fold cross-validation:

- CI<sub>1</sub> selected as the best predictor
- **90% accuracy**, 7% false positive and **13% false negative rates**
- In comparison:
  - Zero-R (always predicting MCS) = 53% accuracy
  - Clinical consensus without CRS-R ≈ 35% false negative
- **Lower error than clinical consensus**

Confusion Matrix	
MCS (true positive)	MCS as UWS (false negative)
15	1
1 UWS as MCS (false positive)	13 UWS (true negative)

- Complexity Index has **high discriminative power** and low false negative & positive rates
- Might provide an inexpensive way to diagnose MCS & UWS and **screen/monitor** CAN connectivity changes
- **Works even if extensive brain damage**
- Future: investigate in a bigger cohort and in non-sedated patients

Reference: Riganello & Larroque, et al. "A Heartbeat Away From Consciousness: Heart Rate Variability Entropy can discriminate disorders of consciousness and is correlated with resting-state fMRI brain connectivity of the Central Autonomic Network." *Frontiers in Neurology* 9 (2018): 769.

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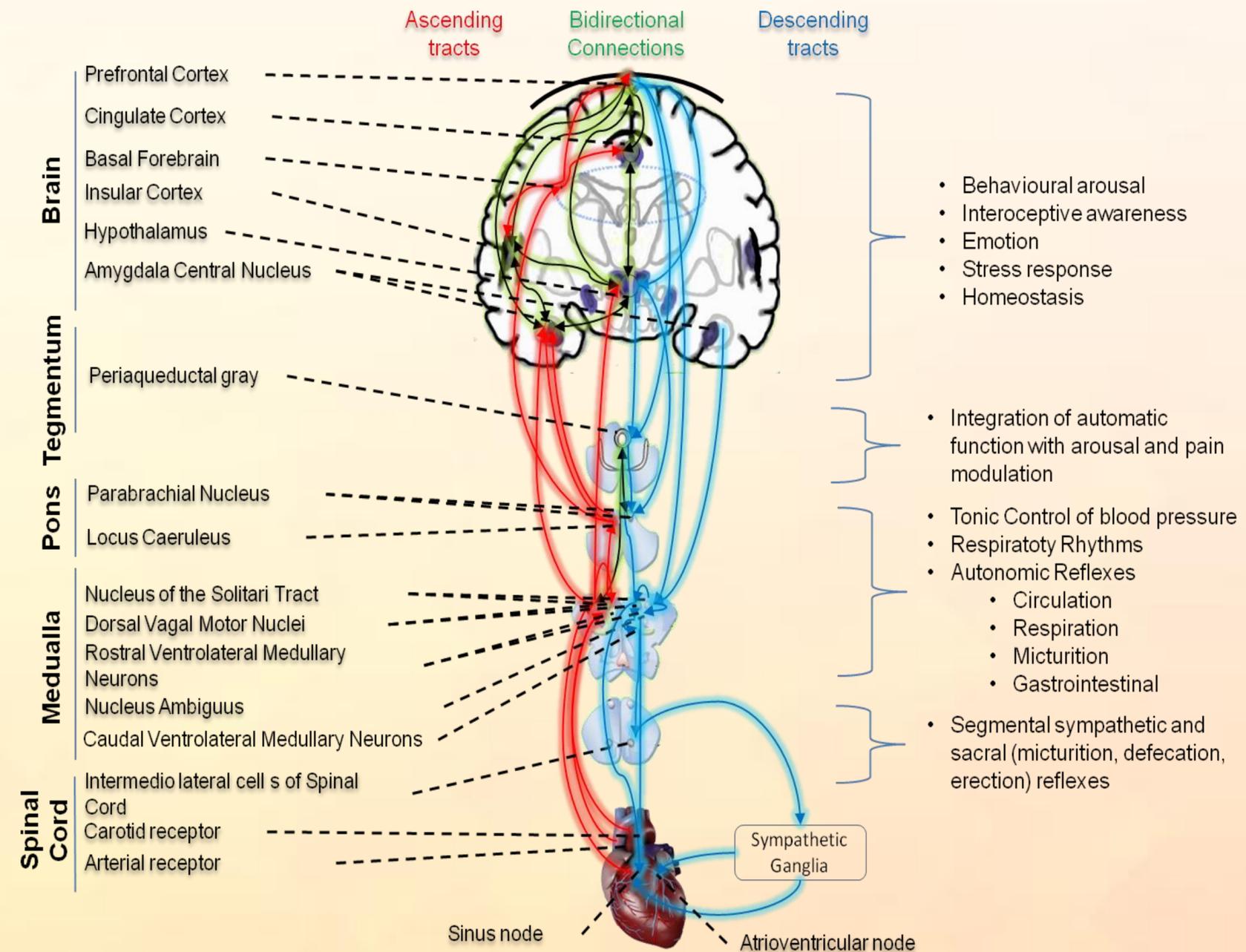
# Bonus slides



# Background

- Healthcare differs if patient is unresponsive (UWS) or minimally conscious (MCS)
- **~35% clinical diagnosis error** which can impact life and death decisions
- **Neuroimaging** helps, but is **expensive and difficult** in daily clinical setting
- Heart and brain's Central Autonomic Network (CAN) are connected in a two-way dynamic interaction through the Autonomic Nervous System (ANS).

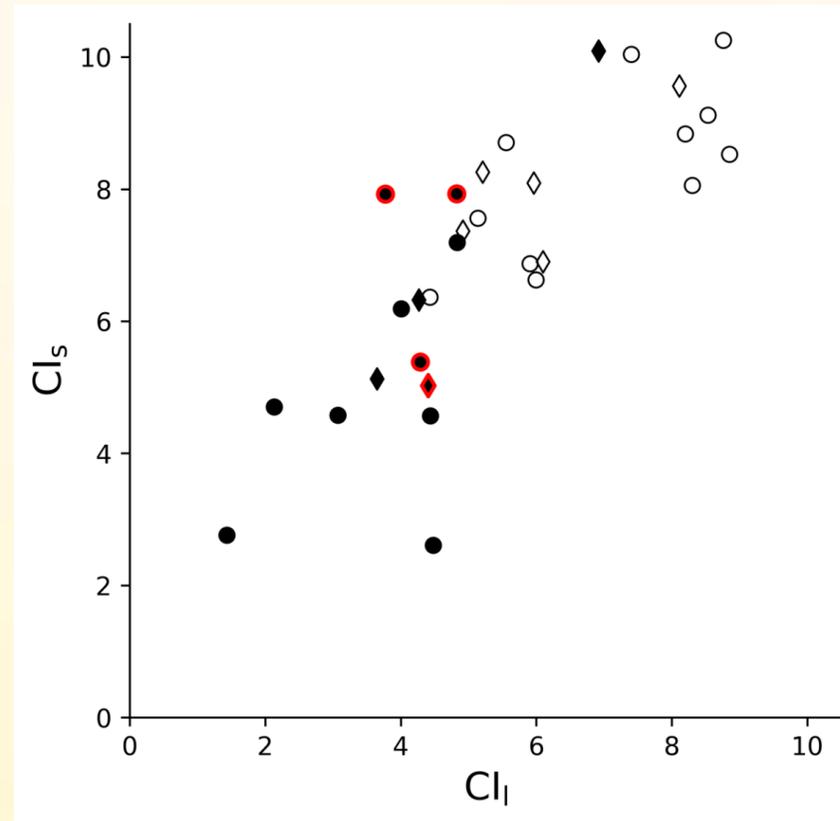
→ Can we better diagnose by monitoring the heart?



# Results 3 - CI reliably discriminates MCS from UWS

One-R classifier with  
10-fold cross-validation:

- $CI_1$  selected as the best predictor
- **90% accuracy**, 7% false positive and **13% false negative rates**
- In comparison, Zero-R (always predicting MCS) has 53% accuracy
- **Lower error than clinical consensus**



Confusion Matrix	
MCS (true)	MCS as UWS (false negative)
15	1
1	13
UWS as MCS (false positive)	UWS (true)

