



# Biosignals for assessment of cybersickness

Assist. Prof. Nadica Miljković, PhD

Signals & systems department

University of Belgrade – School of Electrical Engineering

e-mail: [nadica.miljkovic@etf.bg.ac.rs](mailto:nadica.miljkovic@etf.bg.ac.rs)

URL: <https://bit.ly/2pvosx0>

# Topics

- Motion sickness
- Cybersickness phenomenon
- Biosignals for assessment of motion sickness
- Case study: Cybersickness assessment by electrogastrography (EGG)
- Pathways and pitfalls for EGG for sickness assessment

- 
- This lecture is based on the results prepared for the ICIST 2019 conference, ICT for Automotive Session, Kopaonik, March 10-13, 2019, Serbia.
  - The results presented here are summing collaborative efforts of Faculty of Electrical Engineering, University of Ljubljana and University of Belgrade – School of Electrical Engineering to develop EGG-based appropriate sickness assessment procedure (hardware & software & protocols).

# MOTION SICKNESS



By NASA's Marshall Space Flight Center and Science@NASA (U.S. Federal Government) - [http://science.nasa.gov/headlines/y2001/ast07aug\\_1.htm](http://science.nasa.gov/headlines/y2001/ast07aug_1.htm),  
Public Domain, <https://commons.wikimedia.org/w/index.php?curid=6883973>

# Sickness

- Motion sickness:
  - Seasickness
  - Airsickness
  - Carsickness
  - Trainsickness
- Cybersickness
- Spacesickness



By NASA's Marshall Space Flight Center and Science@NASA (U.S. Federal Government) - [http://science.nasa.gov/headlines/y2001/ast07aug\\_1.htm](http://science.nasa.gov/headlines/y2001/ast07aug_1.htm),  
Public Domain, <https://commons.wikimedia.org/w/index.php?curid=6883973>

# Sickness

- Motion sickness:
  - Seasickness
  - Airsickness
  - Carsickness
  - Trainsickness
  - Cybersickness
  - Spacesickness

**Skiing, camel & elephant riding, wide-screen cinemas, ...**

# Motion sickness symptoms

In general, motion sickness produces unpleasant feeling that can be accompanied by the following symptoms:

- dizziness
- nausea
- sweating
- salivation
- stomach discomfort
- vomiting
- fatigue
- vertigo
- headache
- pallor
- fullness of stomach
- disorientation
- ataxia
- depressed appetite
- dryness of mouth
- eye strain
- warmth/flushing
- tremor
- ...



# In case you wondered ...

Or you knew. Animals can experience motion sickness too.



# Causes

- Not discovered, yet.
- Three theories:
  - Sensory conflict theory (widely used)
  - Evolutionary poison theory (the most interesting)
  - Postural instability theory (I'd say similar to sensory conflict theory, posture system “resists” conflicting information together with stomach)
- Reference: Jr. J. J. LaViola, “A discussion of cybersickness in virtual environments,” *ACM SIGCHI Bulletin*, vol. 32, pp. 47-56, 2000, DOI: [10.1145/333329.333344](https://doi.org/10.1145/333329.333344).





# VIRTUAL REALITY & SICKNESS

## CYBERSICKNESS

**“Virtual reality (VR) is the term used to describe a 3D, computer generated environment which can be explored and interacted by a person.”**

<https://www.vrs.org.uk/virtual-reality/what-is-virtual-reality.html> Assessed February 27, 2019



# But, ...

## Health and Safety

\* These health & safety warnings are periodically updated for accuracy and completeness. Check [www.oculus.com/warnings](http://www.oculus.com/warnings) for the latest version.

### **⚠ WARNING** Discomfort

- **Immediately discontinue using the headset if any of the following symptoms are experienced: seizures; loss of awareness; eye strain; eye or muscle twitching; involuntary movements; altered, blurred, or double vision or other visual abnormalities; dizziness; disorientation; impaired balance; impaired hand-eye coordination; panic or anxiety attack; excessive sweating; increased salivation; nausea; lightheadedness; discomfort or pain in the head or eyes; drowsiness; fatigue; or any symptoms similar to motion sickness.**

**Cybersickness  
symptoms**

Health and safety warnings are available online for Oculus Rift and Touch, Oculus Go, and Samsung Gear VR: <https://www.oculus.com/legal/health-and-safety-warnings/> (Assessed February 27, 2019). 25% to 40% of VR consumers experience sickness: <http://fortune.com/2018/02/06/virtual-reality-motion-sickness/> (Assessed February 27, 2019)

# Consequences



The image is a screenshot of a web browser displaying an article on the Ars Technica website. The browser's address bar shows the URL <https://arstechnica.com/gaming/2014/08/developer-cites-motion-sickness-in-delaying-oculus-rift-support/>. The article's title is "Developer cites motion sickness in delaying Oculus Rift support". Below the title is a sub-headline: "VR may never totally solve its 'simulation sickness' problem." The author's name and the date are listed as "KYLE ORLAND - 8/21/2014, 7:40 PM". The Ars Technica logo is visible in the top left corner of the page, and there are navigation links for "SUBSCRIBE" and "SIGN IN" in the top right.

ars TECHNICA

SUBSCRIBE

SEARCH SIGN IN

*STOP THE RIFT, I WANNA GET OFF —*

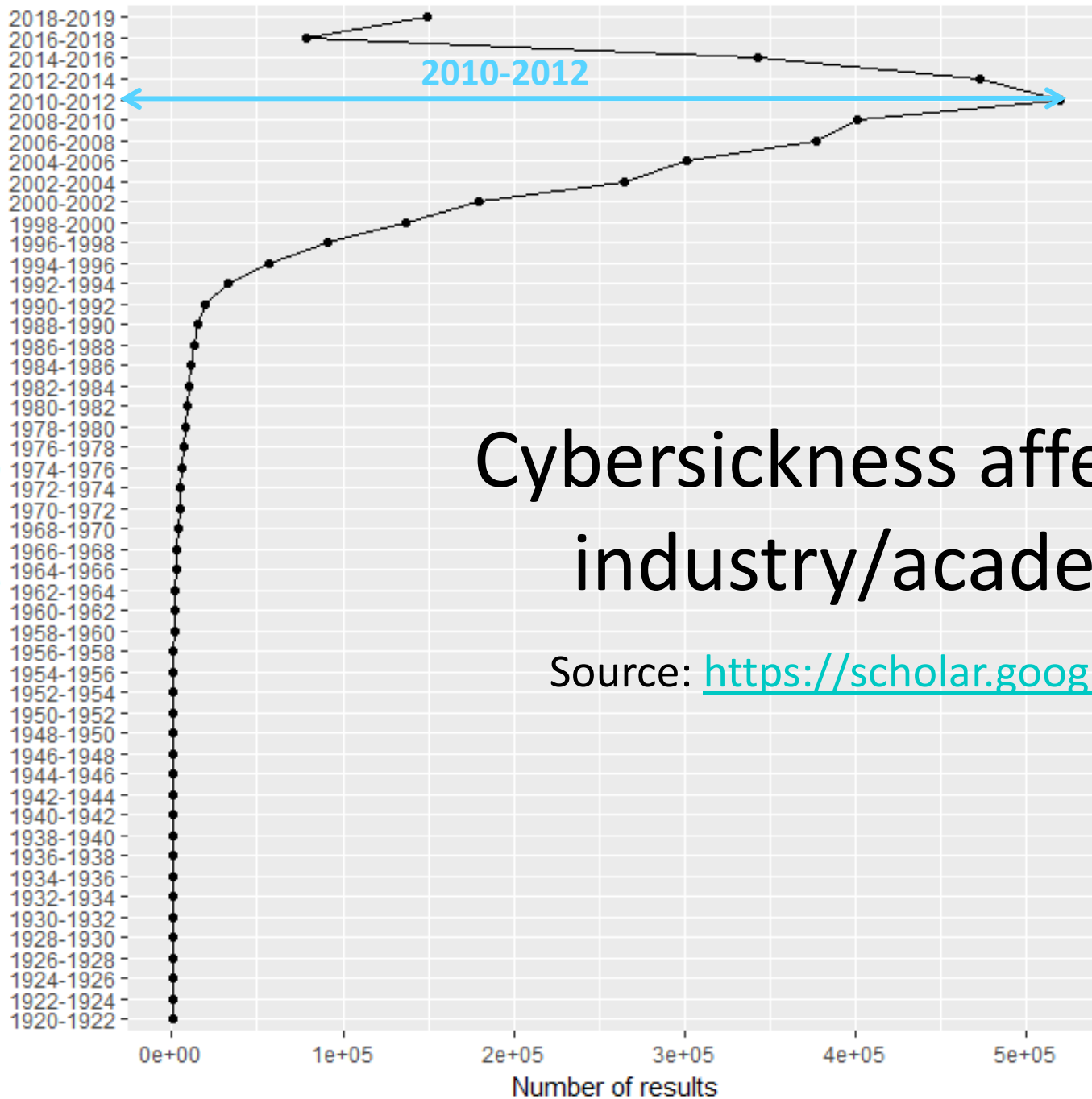
## Developer cites motion sickness in delaying Oculus Rift support

VR may never totally solve its "simulation sickness" problem.

KYLE ORLAND - 8/21/2014, 7:40 PM

<https://arstechnica.com/gaming/2014/08/developer-cites-motion-sickness-in-delaying-oculus-rift-support/>

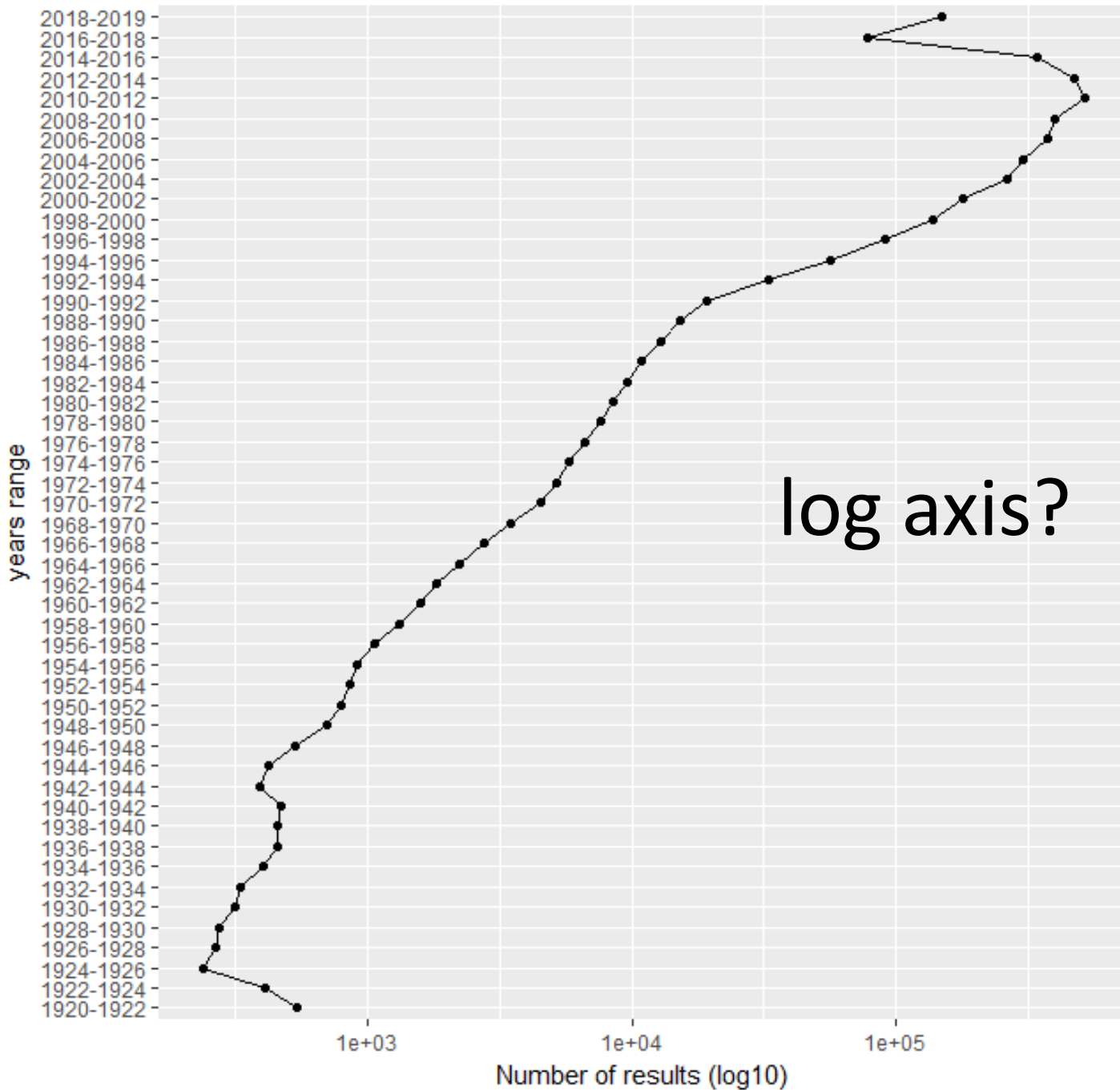
# Keywords <<virtual reality>> in Google Scholar



Cybersickness affects VR  
industry/academia

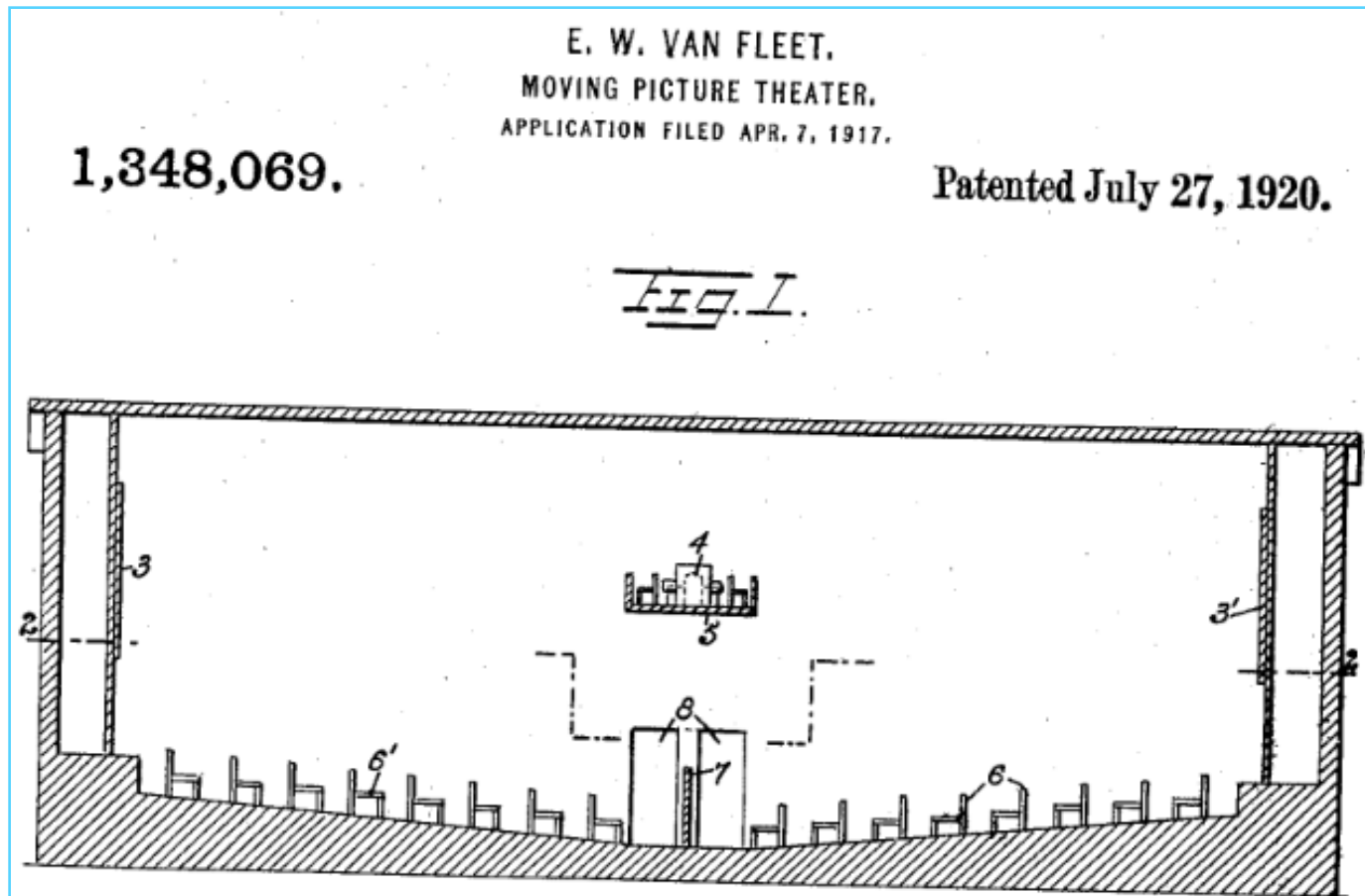
Source: <https://scholar.google.com/>.

# Keywords <<virtual reality>> in Google Scholar





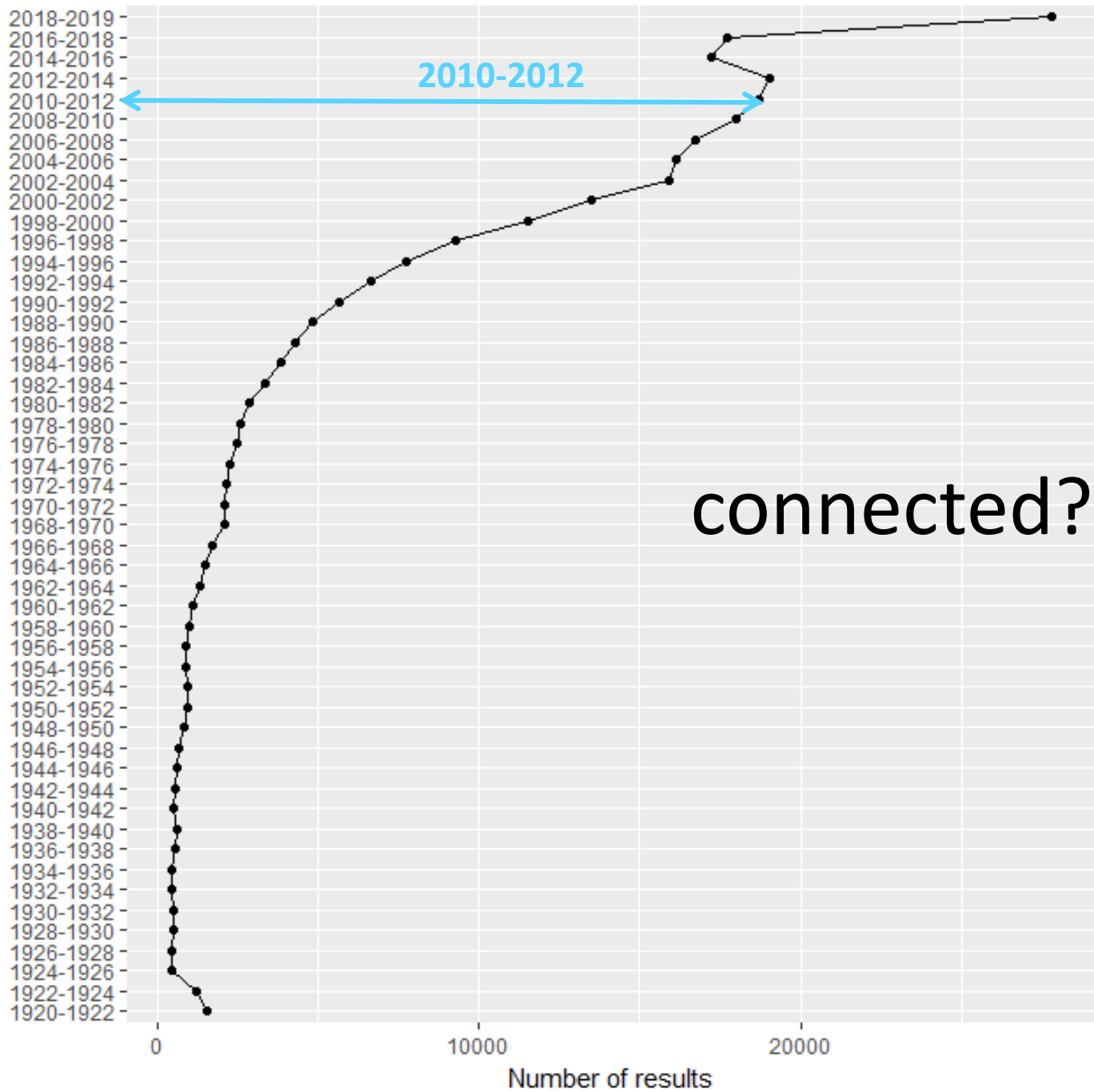
# Moving picture theater



Van Fleet EW, inventor; Donato Cozzolino, assignee. Moving-picture theater. United States patent US 1,348,069. 1920 Jul 27,  
<https://patentimages.storage.googleapis.com/49/51/20/069b866726d929/US1348069.pdf>.



# Keywords <<motion sickness>> in Google Scholar



# INDIVIDUAL DIFFERENCES

# If you are

- female (wider field of view than males)
- young or old
- having fatigue, stress, flu, ear infection, hangover ...
- standing during VR
- using VR with another person(s)
- using VR for longer periods of time
- not in a control
- not Chinese, but Caucasian
- not seeing a horizon during ride
- reading during ride
- using more realistic simulations/VR
- using VR with enhanced flicker
- ...
- applying more than one above-mentioned features

**Chances you'll  
experience motion  
sickness are high!**

# How to suppress the symptoms?

- deep breathing
- eating before experiencing VR (!?)
- relief band (check <https://www.reliefband.com>)
- chewing ginger
- biofeedback
- ...

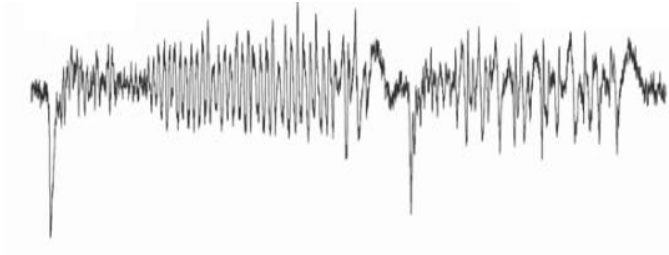
# (CYBER)SICKNESS ASSESSMENT

# Motion sickness manifestations

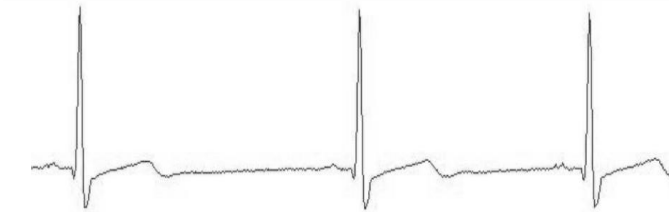
See Paul Green “Motion Sickness and Concerns for Self-Driving Vehicles: A Literature Review”, Technical Report UMTRI-2016, The University of Michigan,  
<http://umich.edu/~driving/publications/Motion-Sickness--Report-061616pg-sent.pdf> (assessed on April 1, 2019).

# Biosignals

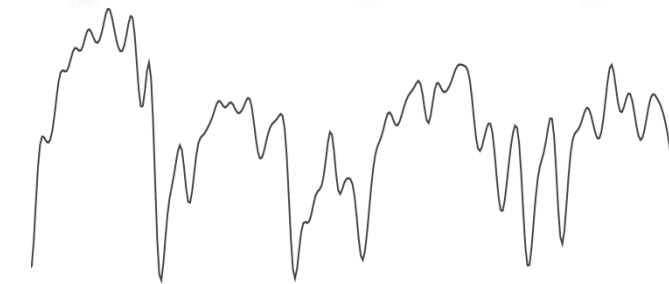
EEG



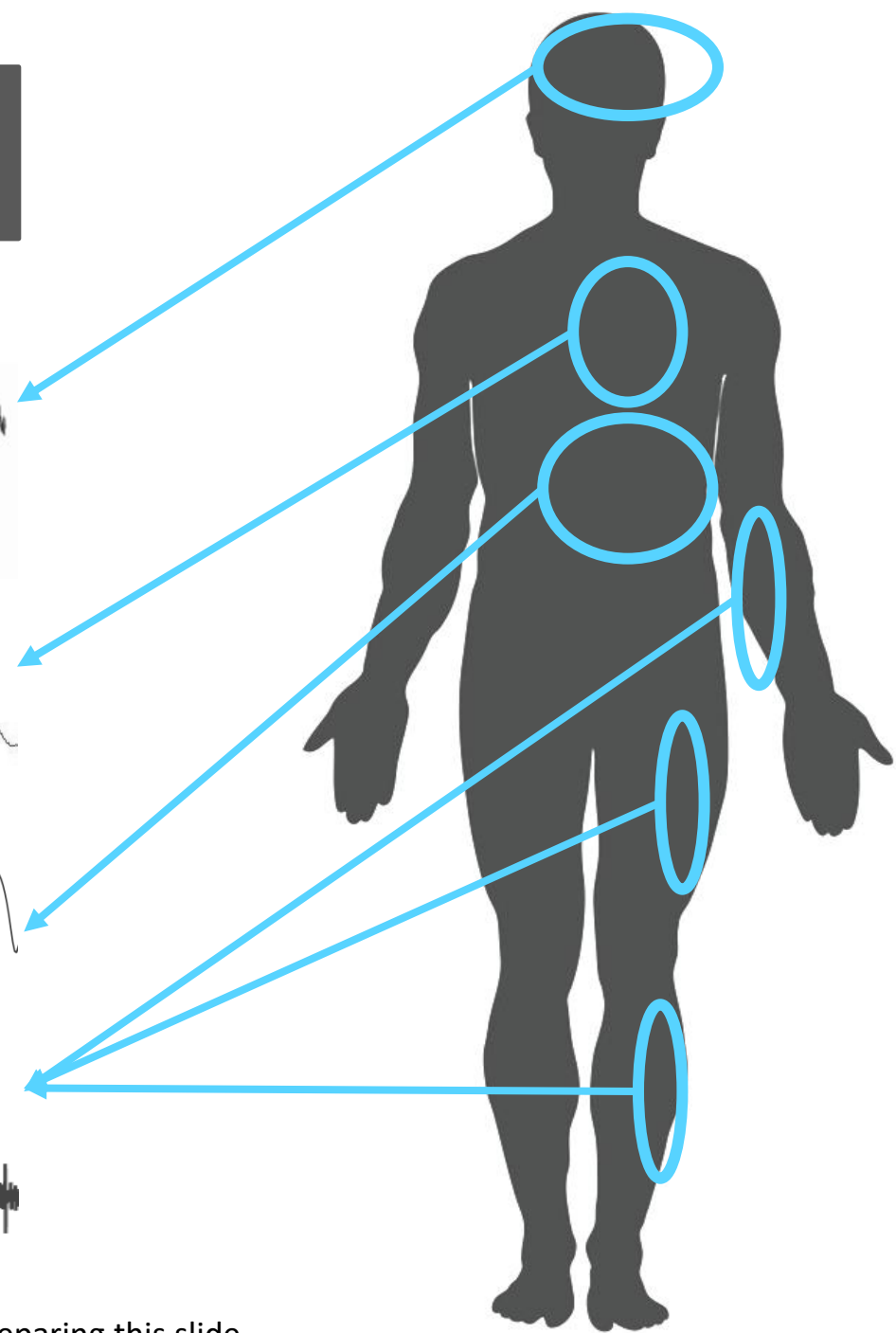
ECG



EGG



EMG



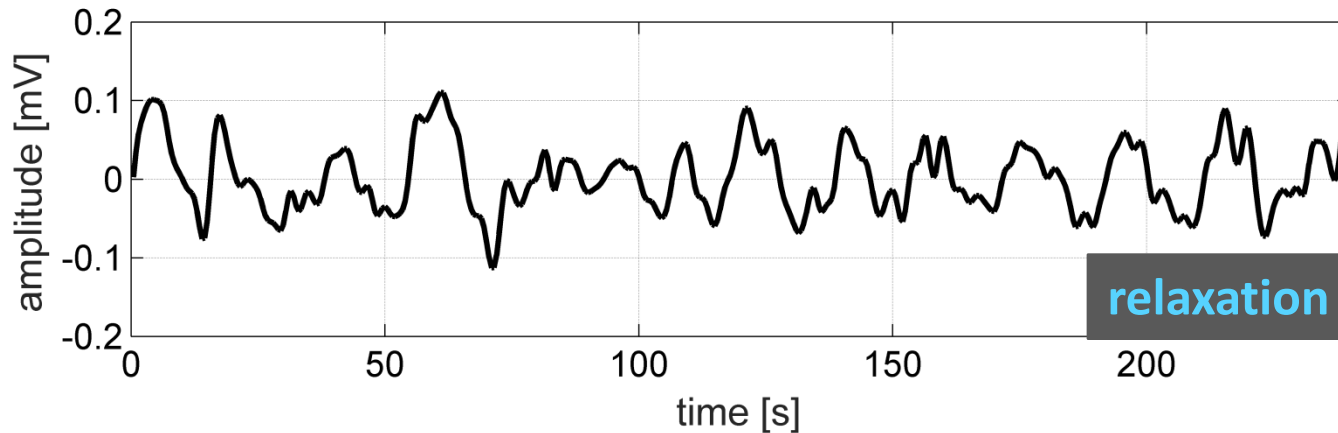
Special thanks to my PhD student Nenad B. Popović for preparing this slide.



# Previously used biosignals

- sweating measured by GSR/EDA (galvanic skin response, electrodermal activity)
- gastric myoelectric activity measured by EGG (electrogastrography)
- eye blink rate measured by EOG (electrooculography)
- respiration
- cardiac vagal tone measured by ECG (electrocardiography)
- delta power of EEG (electroencephalography)
- skin temperature
- ...

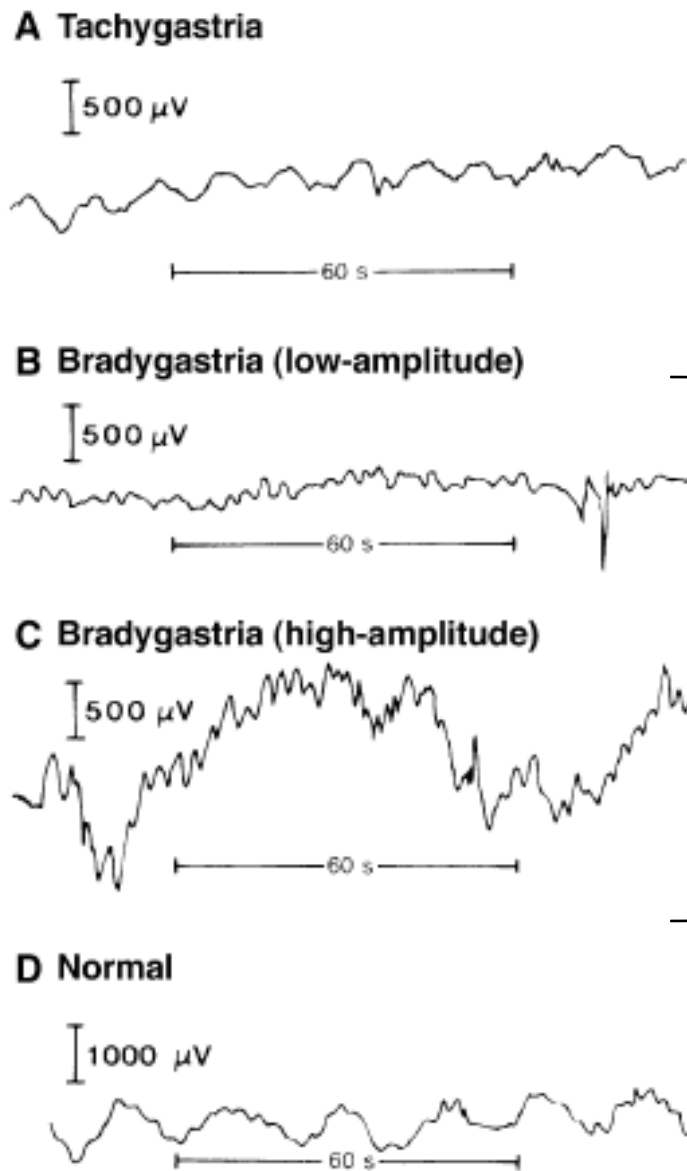
# We propose ... EGG



- EGG is a method that records electrical activity of stomach smooth muscles by placement of surface Ag/AgCl electrodes over stomach.
- EGG during relaxation is presented in figure.
- Very slow activity.
- Three typical rhythmical ranges:
  - Normal – normogastria: 2-4 cpm (cycles per minute)
  - Fast – tachygastria: 4-10 cpm
  - Slow – bradygastria: 1-2 cpm

## Morning sickness in pregnancy

Reprinted by permission from Springer Nature: Experimental Brain Research, Gastric dysrhythmias: a potential objective measure of nausea, Kenneth L. Koch, [COPYRIGHT] (2014), license number: 4561290738661.



The most vulnerable range to artifacts

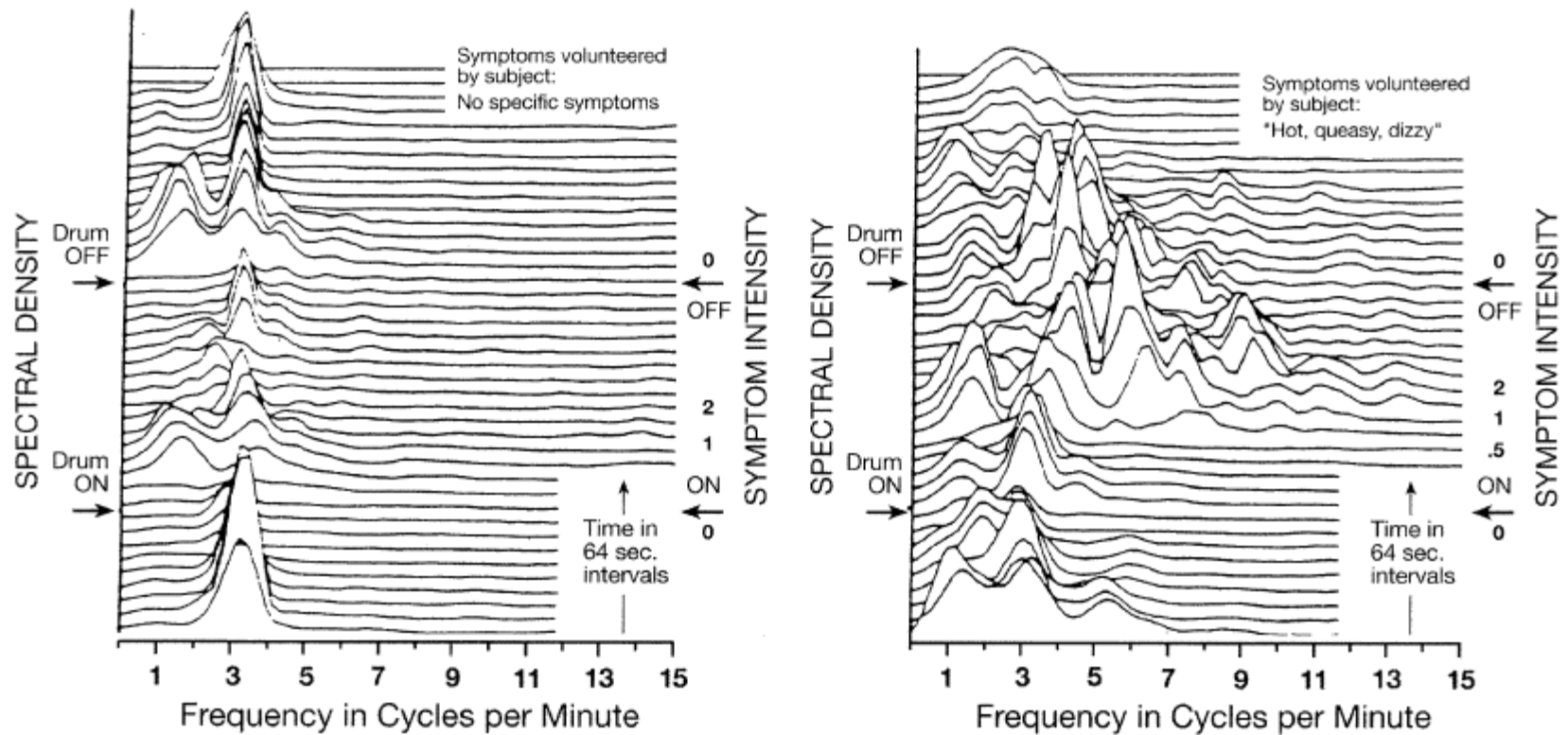
**Fig. 3** Spectrum of gastric dysrhythmias recorded from women with morning sickness during the first trimester of pregnancy. Dysrhythmias range from tachygastric to bradygastric. Women who had normal 3 cpm myoelectrical activity (*Panel D*) had little or no nausea on the morning of the recordings. See text for details

# Invasive & endoscopic (minimally invasive) EGG

- We are not using it... but they should be mentioned.
- Cutaneous EGG lacks resolution and is prone to artifacts
- Reference: Farajidavar A. Bioelectronics for mapping gut activity. Brain research. 2018;1693:169-73, DOI: [10.1016/j.brainres.2018.03.004](https://doi.org/10.1016/j.brainres.2018.03.004).

# EGG & motion sickness

- Used previously and its potential has been recognized.
- Has been shown that:
  - dysrhythmias in EGG signal that can be either faster (tachygastria) or slower (bradygastria) than normal EGG rhythm (2-4 cpm, cycles per minute)
  - during motion sickness, total power of EGG increases
- However, there have been reports on limitation of this procedure... [see Gavvani, A. M., Walker, F. R., Hodgson, D. M., & Nalivaiko, E. (2018). A comparative study of cybersickness during exposure to virtual reality and "classic" motion sickness: are they different?. *Journal of Applied Physiology*]



**Fig. 2** Gastric electrical activity recorded during exposure to illusory self-motion produced by an optokinetic drum in healthy subjects. The *left panel* shows consistent 3 cpm EGG activity during drum rotation in a healthy subject who reported no symptoms of nausea. The *right*

*panel* shows the acute development of tachygastrias from 4 to 9 cpm after approximately 5 min of drum rotation and the concomitant development of nausea related to motion sickness. See text for details

EGG-BASED ASSESSMENT PROCEDURE  
CASE STUDY



# Research questions

- The key research questions presented in this paper are:
  - Can EGG effectively measure cybersickness?
  - What is the appropriate EEG-based parameter (PSD shape and/or PSD power)?
  - Are there any EGG related individual characteristics in two similar VR environments?

Modified photo: question by masa osada; Flickr

<https://www.flickr.com/photos/120386744@N07/47235675622/>;

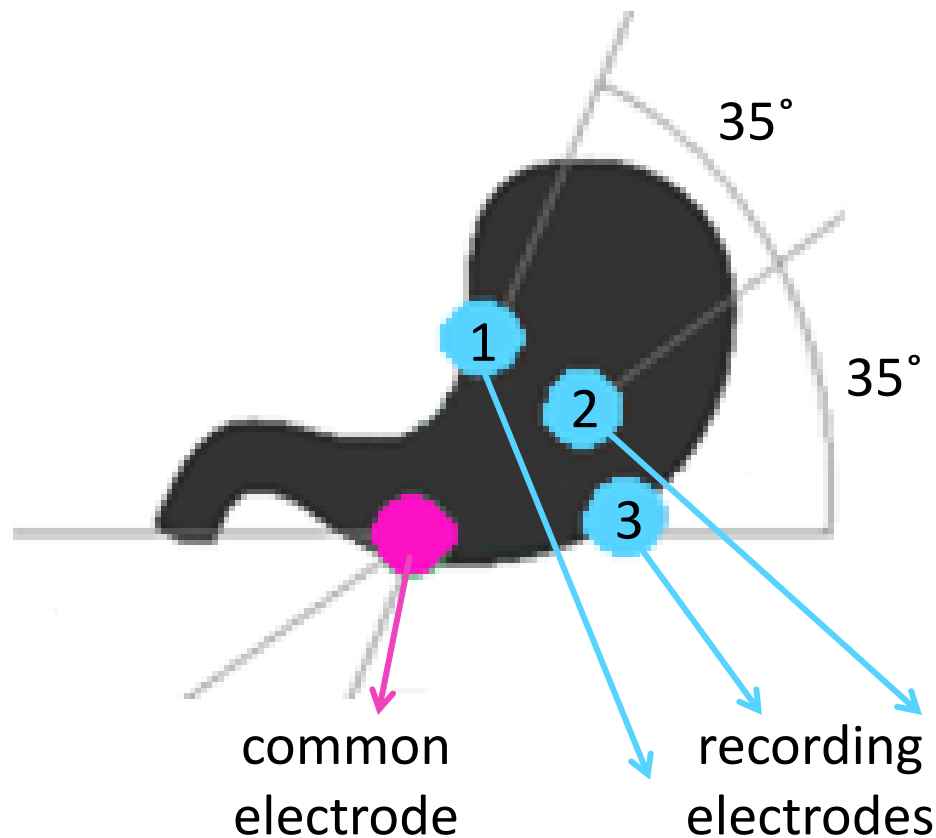
CC-BY-NC-ND 2.0 Generic.



# Hardware & software

- Three EGG channels.
- Hardware:
  - Ag/AgCl electrodes
  - EGG device: amplification and filtering
  - NI USB 6210 A/D (National Instruments Inc., Austin, USA) digitization
- Software:
  - custom-made LabVIEW software (National Instruments Inc., Austin, USA).
- Parameters: 16 bits of resolution, gain of 1000 and sampling frequency of 2 Hz.

# Electrode placement



According to: N. B. Popović, N. Miljković, M. B. Popović, "Simple gastric motility assessment method with a single-channel electrogastrogram," *Biomedical Engineering/Biomedizinische Technik*, in print, 2018, DOI: [10.1515/bmt-2017-0218](https://doi.org/10.1515/bmt-2017-0218).

Reference electrode is placed on *iliac crest*.



# Measurement procedure



Rock Falls, Epic Roller Coaster VR by Grey The Gamer

<https://youtu.be/kse7JqNVDxs>



T-Rex Kingdom, Epic Roller Coaster VR by Grey The Gamer

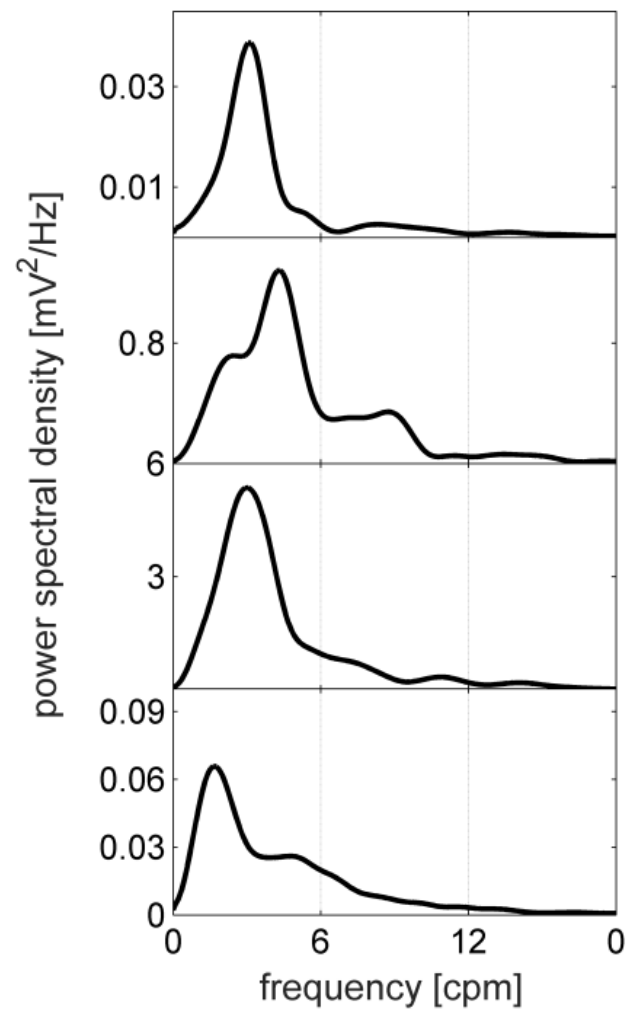
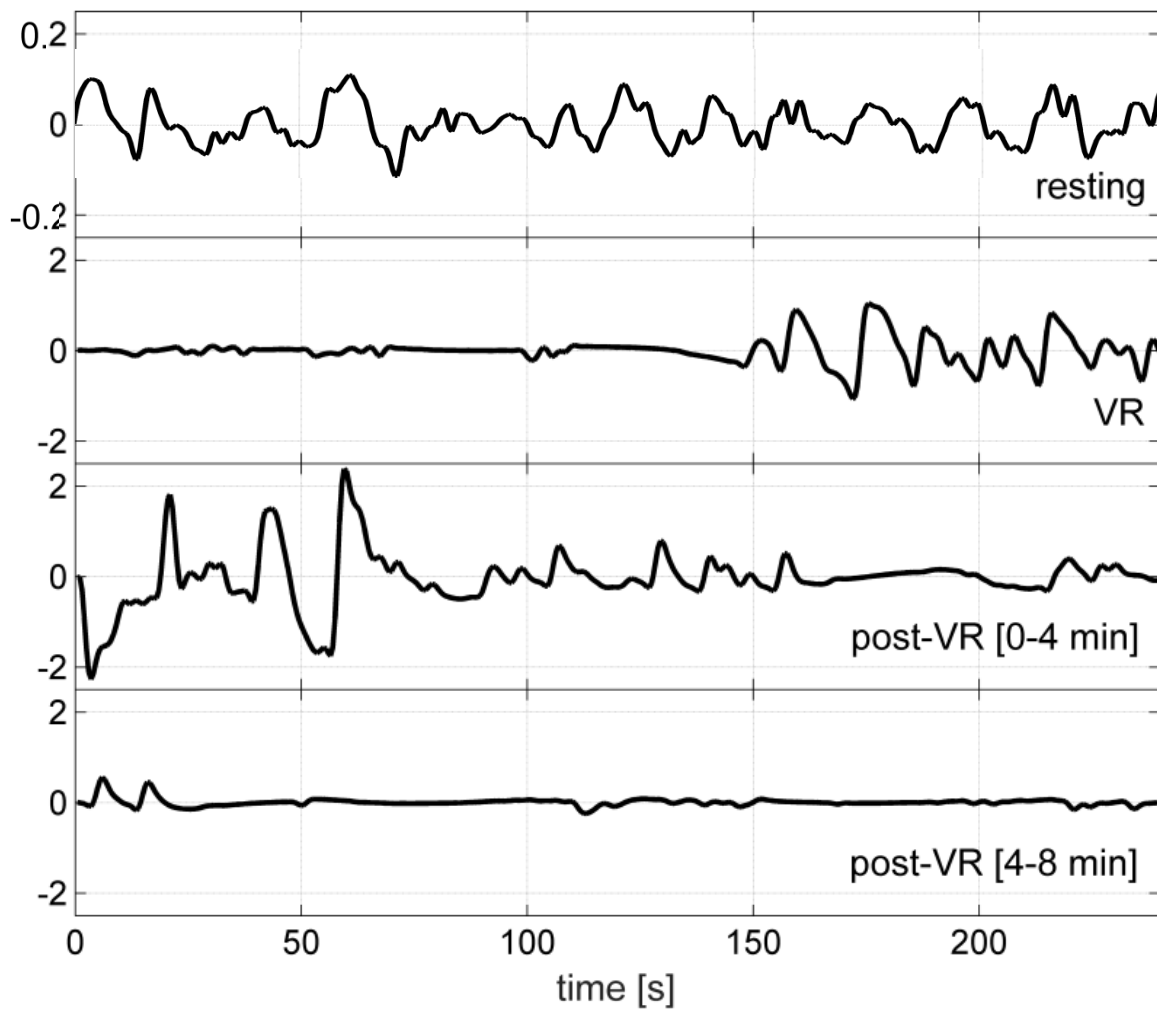
<https://youtu.be/MzVGITUuCGA>

- Three subjects
- Procedure:
  - 5 min relaxation before both sessions
  - 1<sup>st</sup> session: Rock Falls VR (RF VR) roller coaster (4 min), and 2<sup>nd</sup> session: T-Rex Kingdom VR (TRK VR) roller coaster (6 min 20 s)
  - post-VR (8 min)
- Instructions:
  - To avoid excessive movements
  - To raise right hand if they feel sick
  - To inform investigator if they cannot continue

# EGG pre-processing

- In order to reduce noise:
  - 5<sup>th</sup> order Butterworth band-pass filter (from 0.0167 Hz to 0.3333 Hz i.e. from 1 cpm to 10 cpm)
- In order to assess parameters in spectral domain:
  - Welch power spectral density (PSD) with Hamming window (overlap of 50%) for periodogram

# Recorded & filtered signals



# Quantitative outcome measures

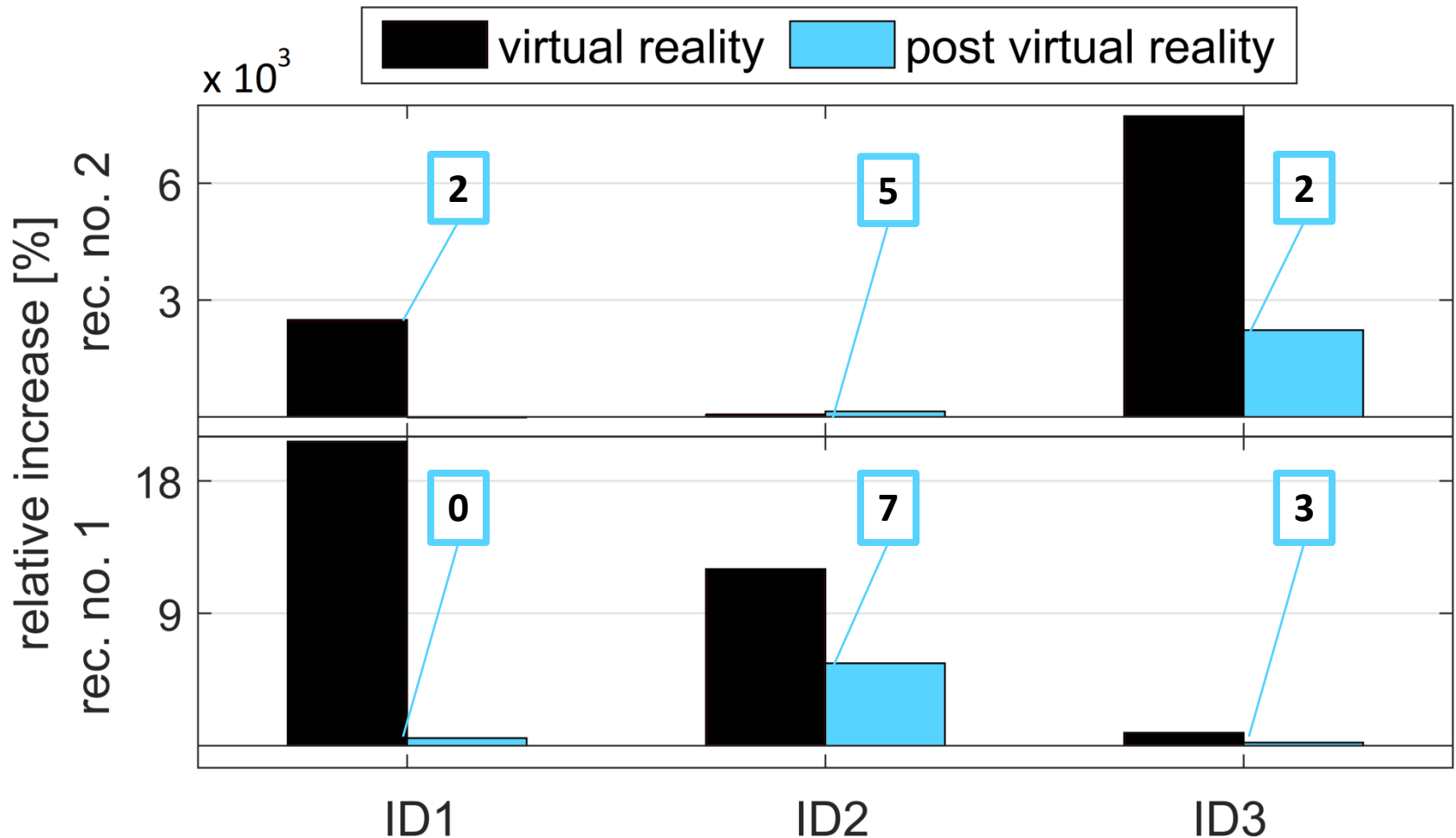
- Calculated EGG parameters in frequency domain:
  - Shape (crest factor and median frequency)
  - Spectral power (total and for three ranges)
- We chose channel ch1, since no excessive noise (by visual inspection) was found in channel ch1 in all recordings.
- All parameters were calculated for three intervals:
  - resting period of 5 min duration,
  - VR sequence
  - post-VR (8 min duration).

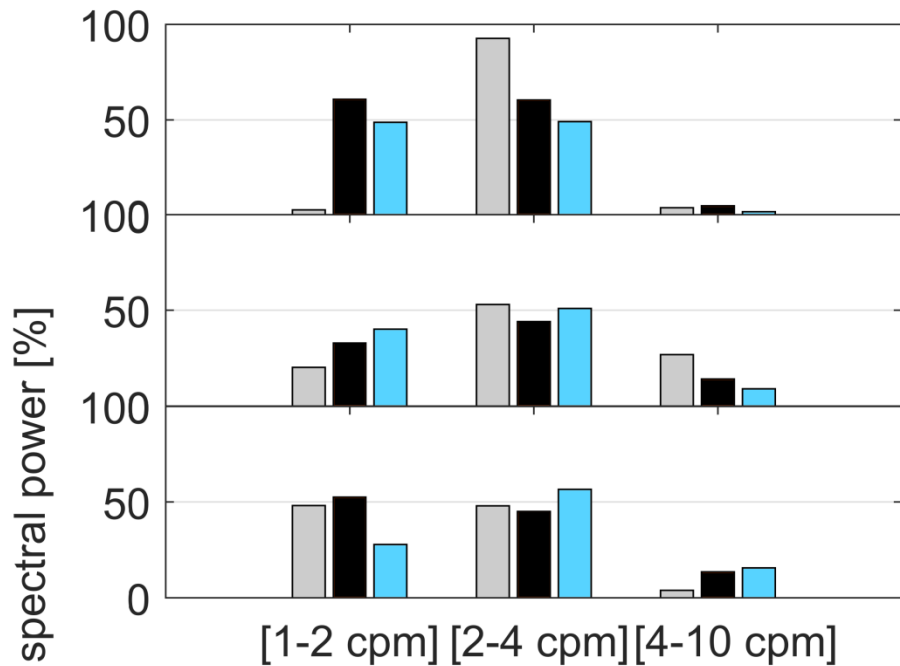
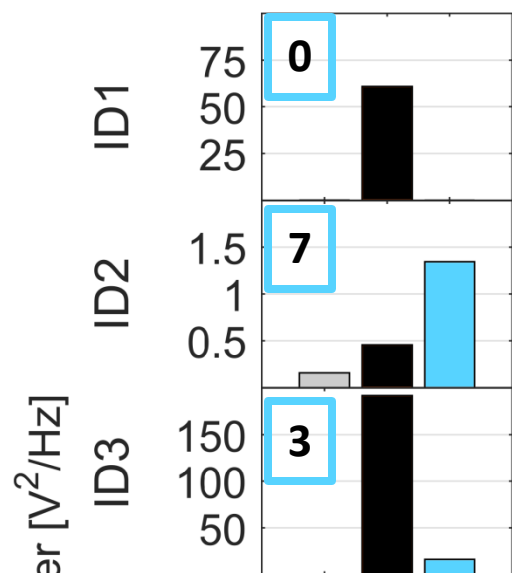
# Qualitative outcome measures

- Subjective scale:
  - 0: no nausea
  - 1: ...
  - 10: almost vomiting
- Number of self-reported cybersickness episodes were noted.

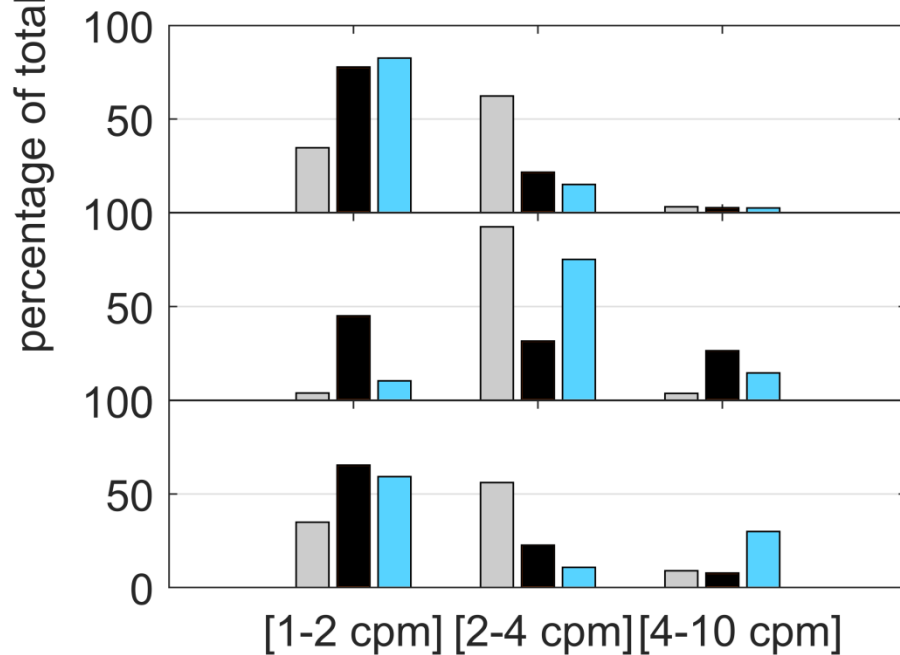
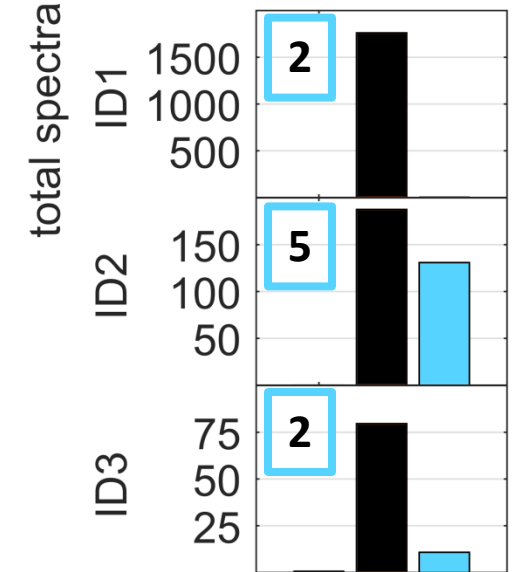


# Power increase compared to relaxation





recording #1



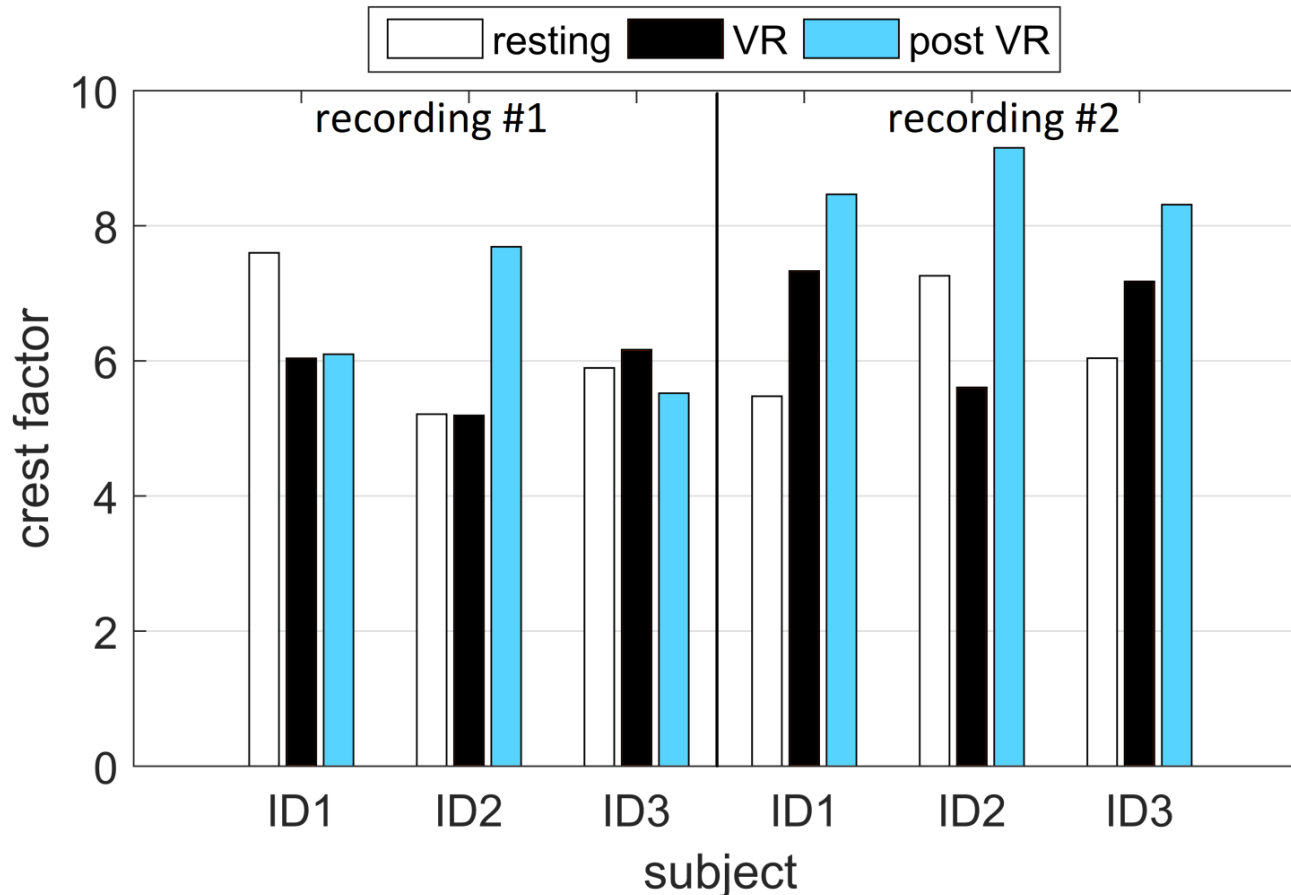
recording #2

# Median frequency

subjects	RF VR / TRK VR		
	Relaxation	VR sequence	post-VR sequence
ID1	0.06 / 0.05	0.05 / 0.04	0.06 / 0.04
ID2	0.06 / 0.06	0.06 / 0.06	0.05 / 0.06
ID3	0.05 / 0.05	0.05 / 0.05	0.06 / 0.05

- Median frequencies are presented in Hz
- RF VR is Rock Falls Roller Coaster VR
- TRK VR is T-Rex Kingdom Roller Coaster VR

# Crest factor



- crest factors  $\sim 1$  indicate no peaks, higher the crests  $\rightarrow$  higher the peaks prominence
- recording #1 is Rock Falls Roller Coaster VR
- recording #2 is T-Rex Kingdom Roller Coaster VR

# Anxiety

1



2



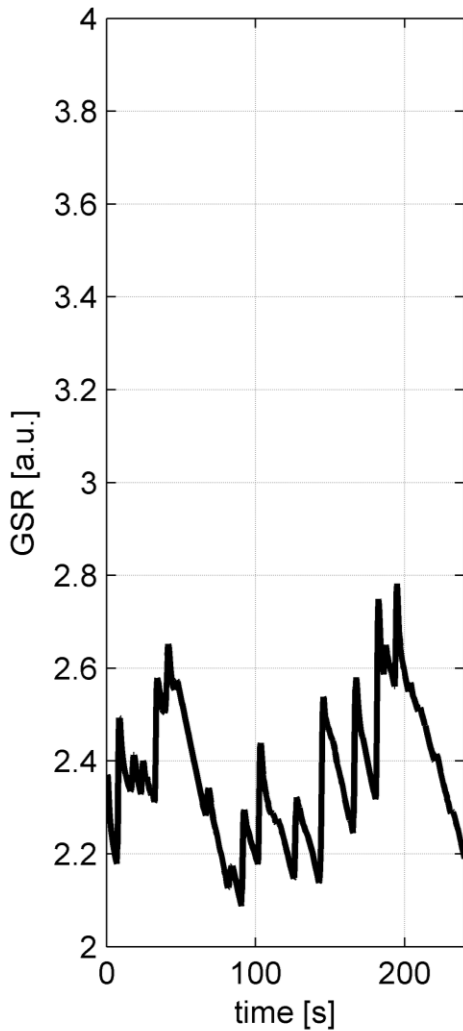
3



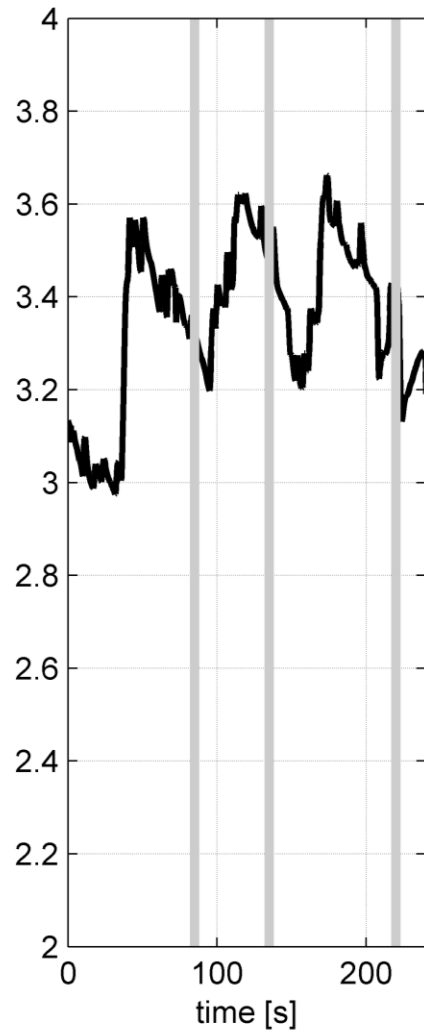
- Anxiety (acrophobia *i.e.* fear of heights) might be increasing cybersickness.
- On a scale from 0 to 10, subject reported 7 (critical moments 1-3 presented above) compared to 5 for VR without heights.
- Screenshots Rock Falls, Epic Roller Coaster VR by Grey The Gamer, 2018, <https://www.youtube.com/watch?v=kse7JqNVDxs> at the moments when subject reported cybersickness (Assessed on March 2, 2019).

# Sickness episodes are marked during VR

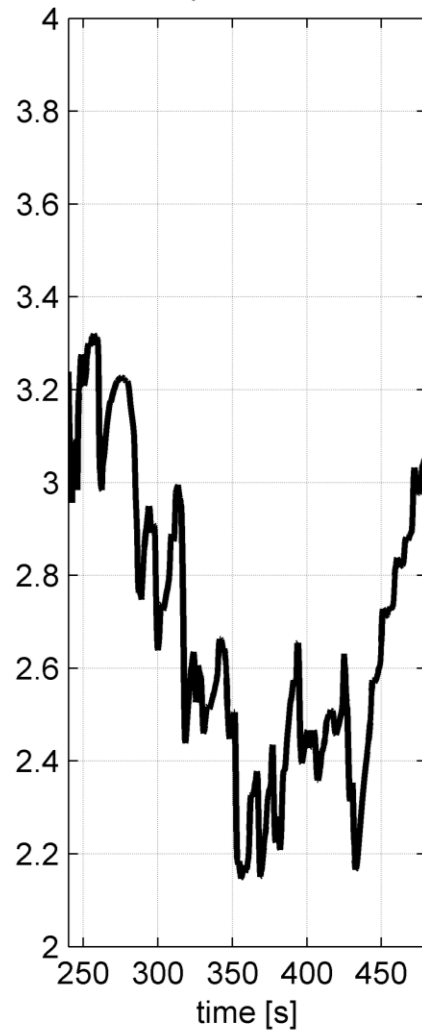
Relaxation



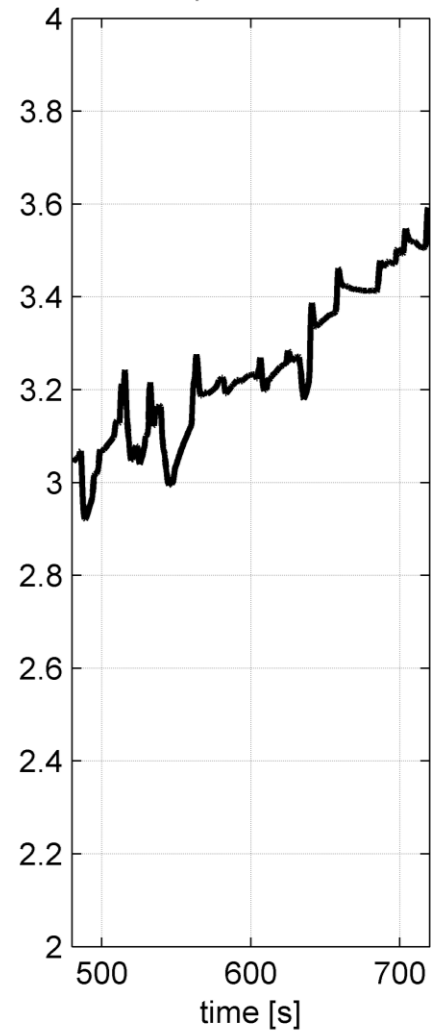
VR



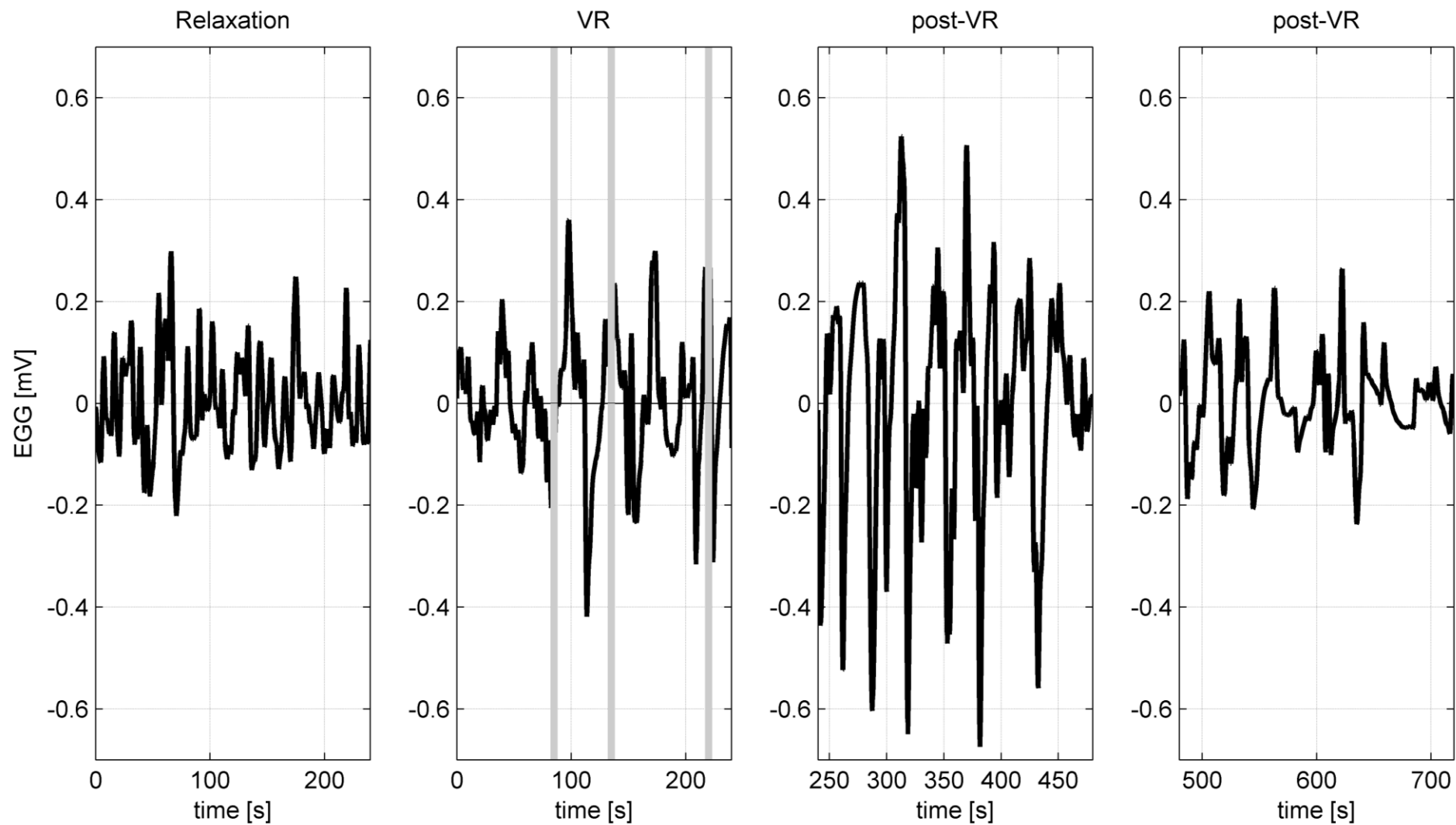
post-VR



post-VR



# Sickness episodes are marked during VR



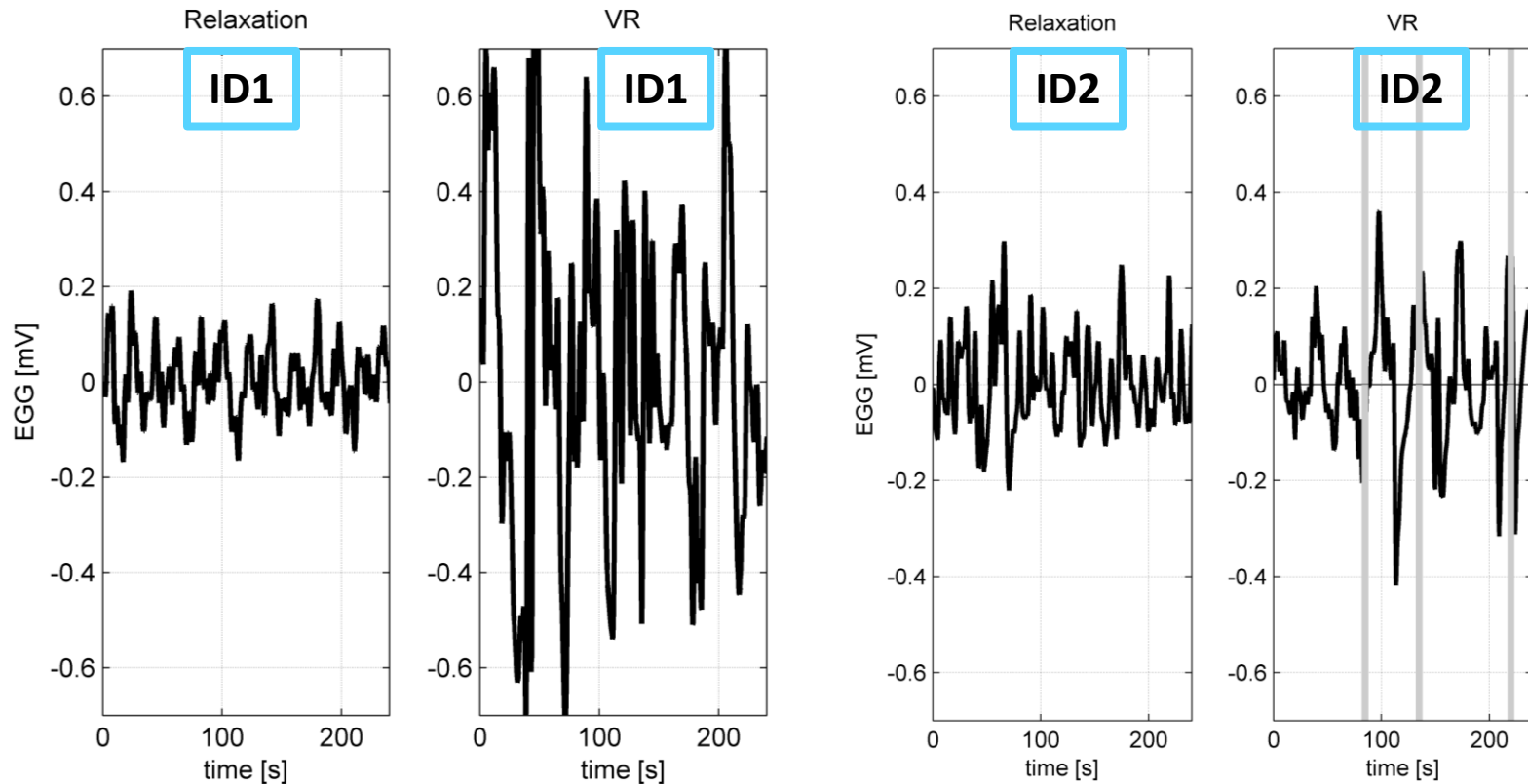
# So, notes should be noted!



- ID1: “Sudden cessation of movement was unpleasant.”
- ID2: “Sudden changes of acceleration and direction of movement (especially rotation) were unpleasant.”
- ID3: “Negative prediction due to previous experiences caused unpleasant sensation.”



# What about excitement?



- ID4: additional one-session measurement
- subject was naïve for Oculus Rift and VR
- RF VR scenario experience revealed immediate increase in EGG TP of PSD after application of VR headset
- In figures, naïve subject ID1 and experienced ID2 are presented on left and right panels, respectively.

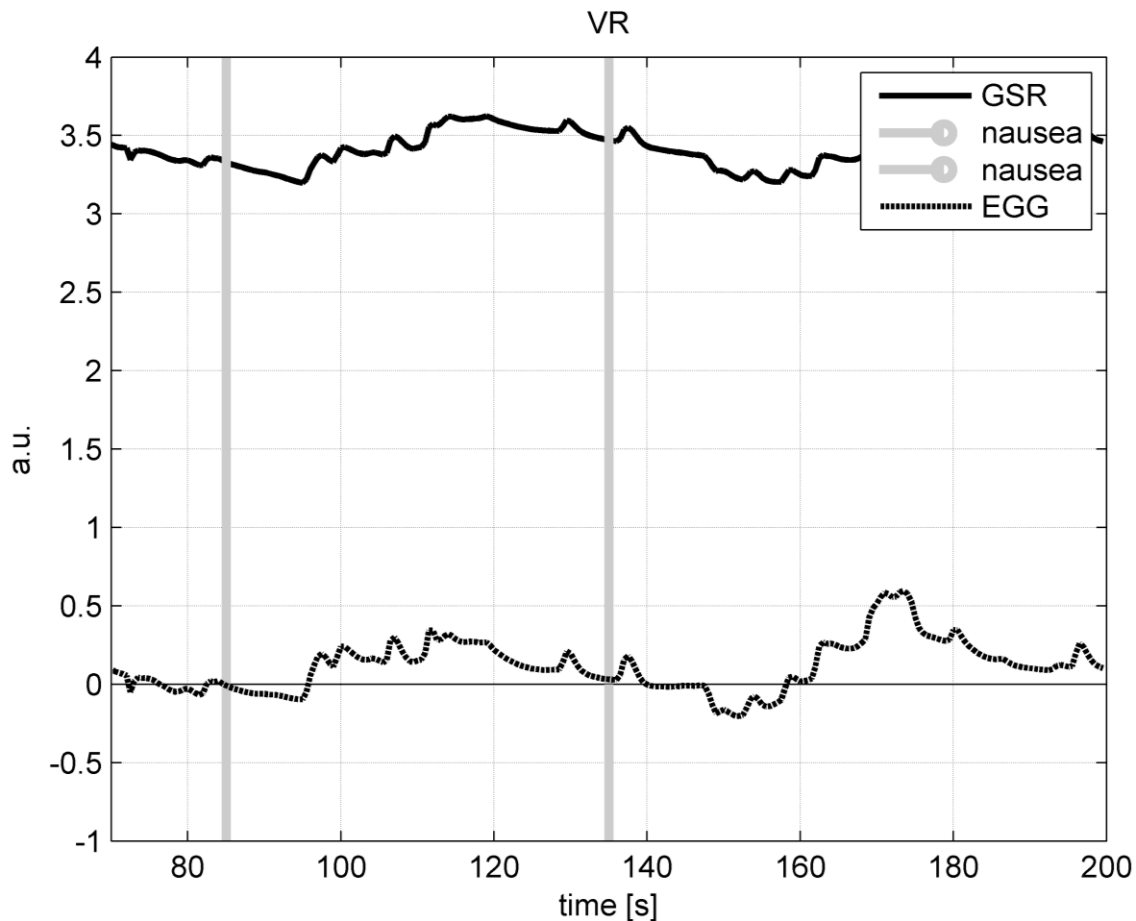
# Overall on pathways

- total power change and power shares proved usable
- dysrhythmias can be assessed
- easily applicable (surface Ag/AgCl electrodes)
- prosperous combination for analysis of EGG and other signals
- duration of power changes after VR
- emotions might be influencing the results and this combination is a promising field to examine

# and pitfalls

- skin-electrode impedance can be tricky to accomplish
- vulnerability to body movements, fat tissue, and surrounding signals (ECG, breathing)
- median frequency is not indicative at all
- crest factor may be indicative, but also may be not
- individual and VR dependent differences exist, but might be to complex to study
- power increase may not correlate with qualitative assessment
- no consensus about normalization procedure (in Dennison M. S. et al., Use of physiological signals to predict cybersickness. Displays. 2016;44:42-52. “**dividing data from all epochs by the baseline data**” was proposed)

# Channel saturation



**corr = 0.74**

- cross-talk indicates noisy EGG (with other EGG channels and other signals)
- for details, see reference: O'Grady G. Gastrointestinal extracellular electrical recordings: fact or artifact?. Neurogastroenterology & Motility. 2012;24(1):1-6, DOI: [10.1111/j.1365-2982.2011.01815.x](https://doi.org/10.1111/j.1365-2982.2011.01815.x).

FUTURE RESEARCH

# Future work

- larger and balanced study
- more strict protocol (instructions on VR navigation, eating habits, etc.)
- evaluation of cybersickness in driving simulator
- relation between emotions/anxiety and sickness

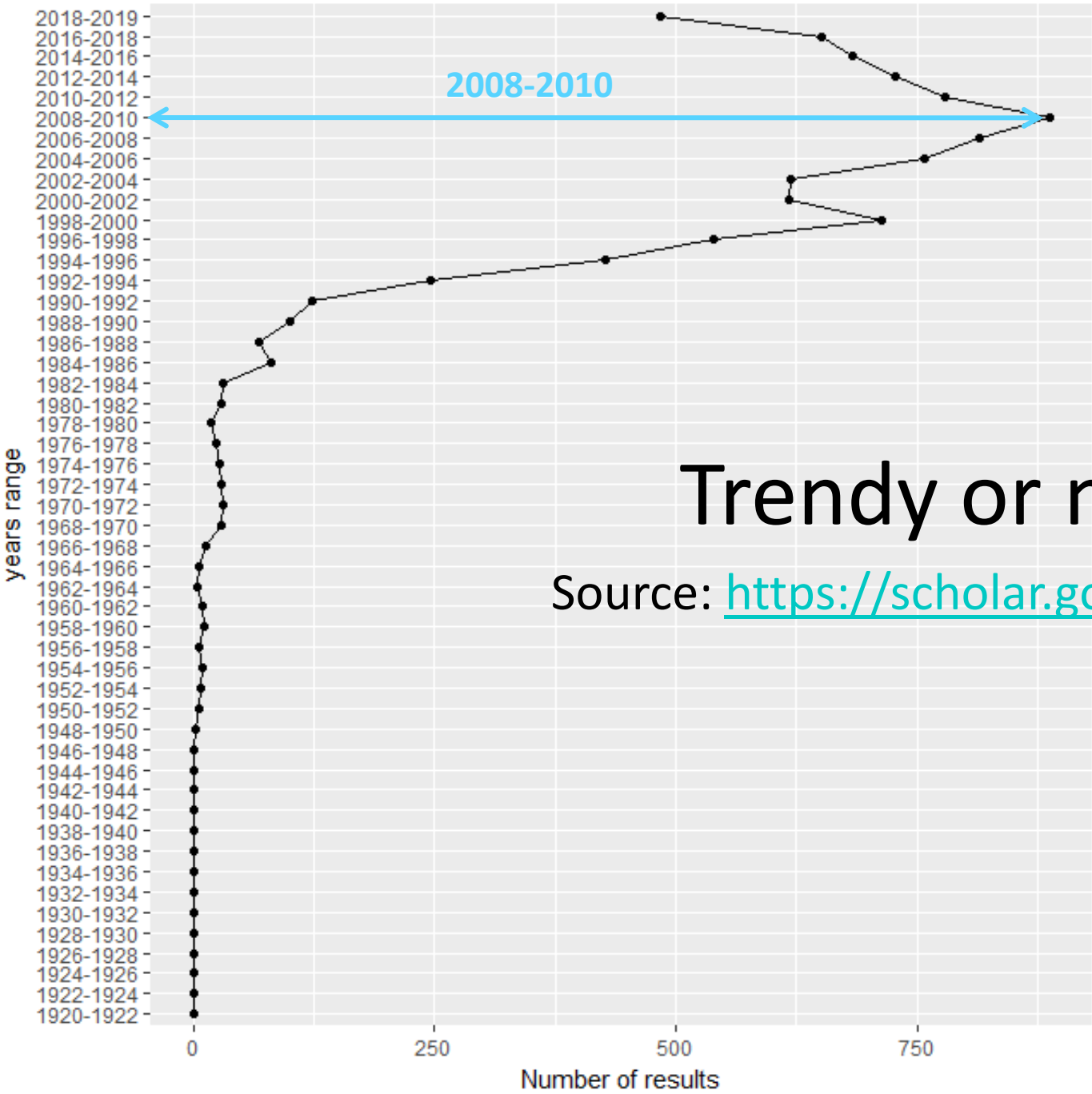
# Flying & driving simulators



Modified Photo: Flying on the ground: VMR-1  
Marines train on simulator by CherryPoint; Flickr  
[https://www.flickr.com/photos/mcas\\_cherry\\_point/6731300823/](https://www.flickr.com/photos/mcas_cherry_point/6731300823/); CC BY 2.0 Generic.

- Appropriate assessment procedures can contribute to better understanding of consequences, nature, and origins of cybersickness.
- Why?
  - boosting VR user experience
  - designing VR and flying & driving simulators
  - proposing strategies/medications to suppress sickness
  - autonomous flying & driving

# Keyword electrogastrography in Google Scholar

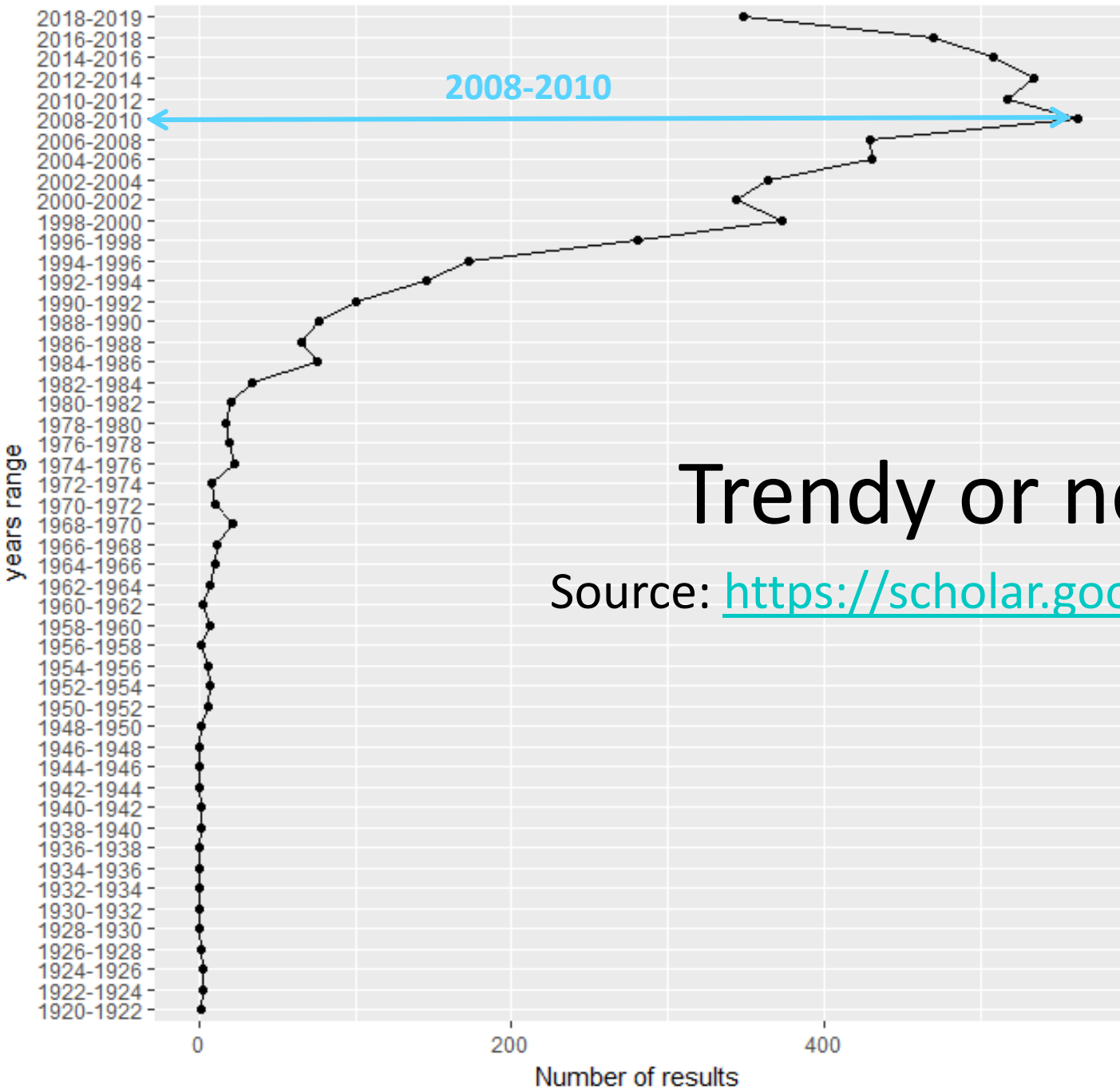


# Trendy or not?

Source: <https://scholar.google.com/>.



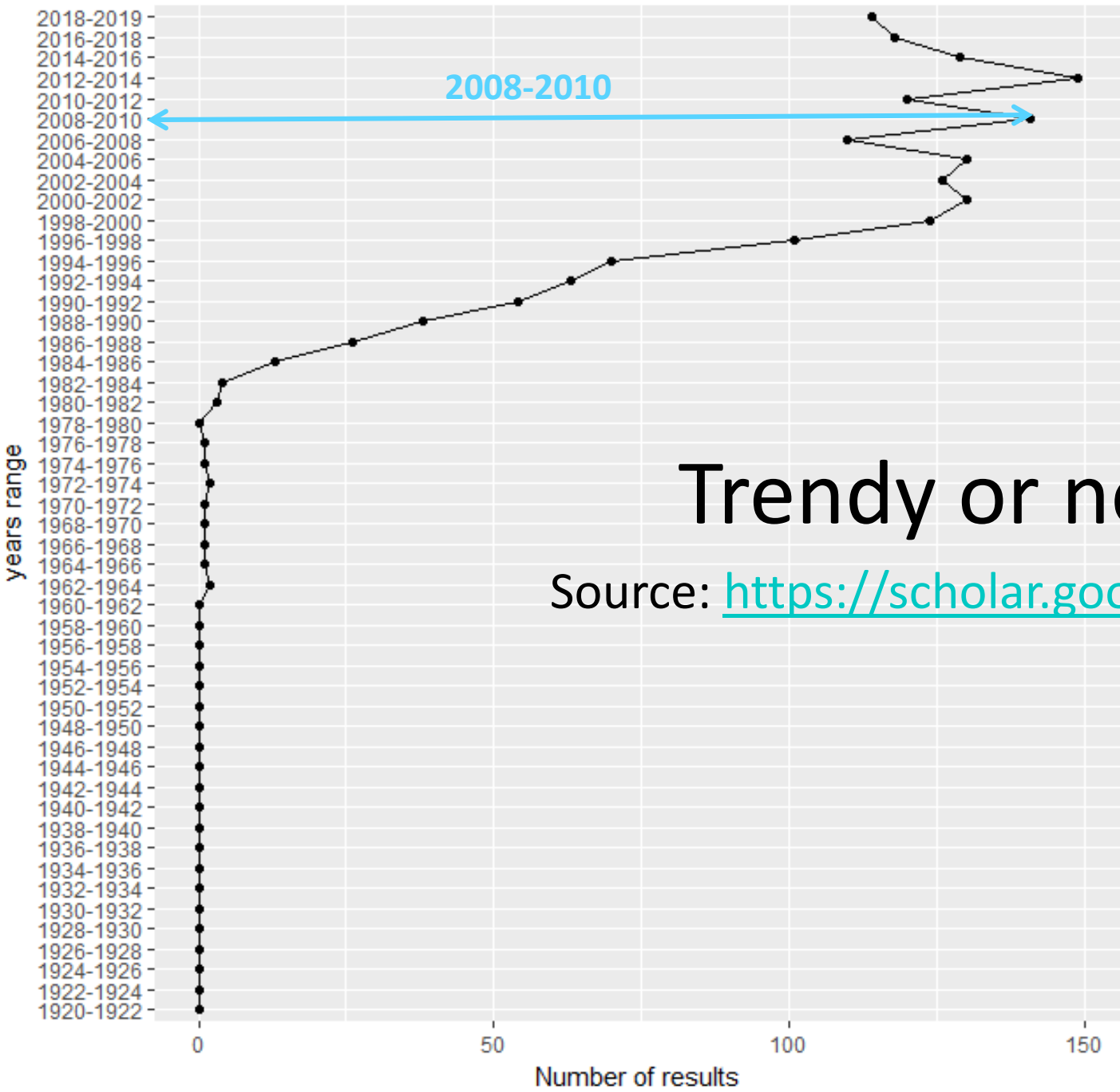
# Keywords <<surface electrogastrography>> in Google Scholar



## Trendy or not?

Source: <https://scholar.google.com/>.

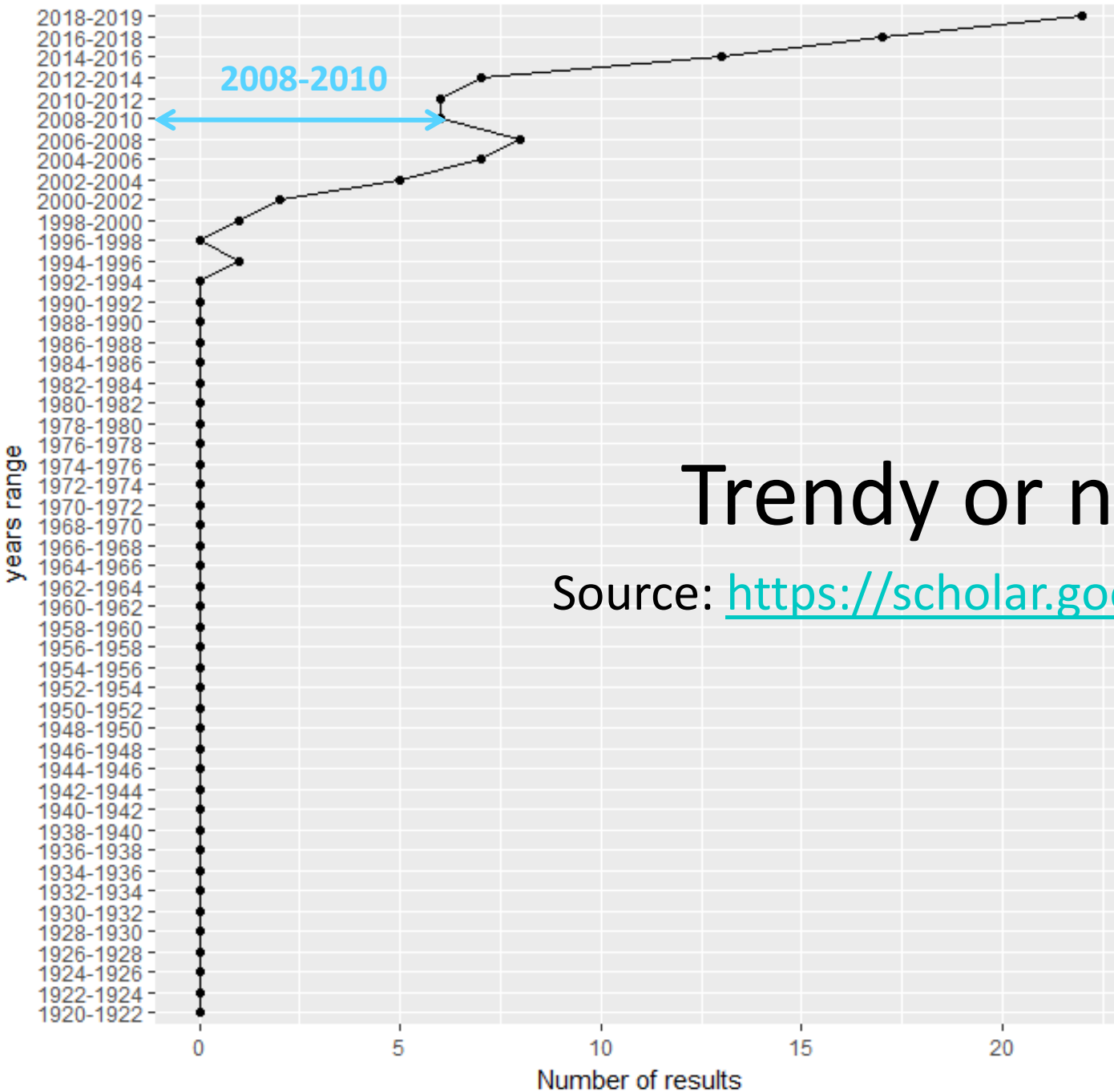
# Keywords <<electrogastrography sickness>> in Google Scholar



## Trendy or not?

Source: <https://scholar.google.com/>.

# Keywords <<cybersickness electrogastrography>> in Google Scholar



## Trendy or not?

Source: <https://scholar.google.com/>.

AT THE END

# Acknowledgement

- I am very grateful to
    - Assoc. Prof. Dr. Jaka Sodnik from Faculty of Electrical Engineering, University of Ljubljana for suggesting cybersickness assessment as a topic for our scientific collaboration.
    - My PhD student Nenad Popović for his enthusiasm, hard work related to EGG and constant efforts directed to improvements of measurement and analysis procedures of EGG signals.
    - To Prof. Sodnik's team from Ljubljana Dr. Kristina Stojmenova, Asst. Prof. Dr. Grega Jakus, and Assistant Timotej Gruden, mag. inž. el.
    - To all our subjects for their patience and kindness.
-

Hands-on EGG measurements during driving simulation in room DrivingSimulator-A04 will be held by Nenad Popović, PhD student at the University of Belgrade – School of Electrical Engineering .

In sickness and in health...

fr. *Mal de mer*, Modified Photo: Stormy Weather (Ferry from La Palma to Tenerife) by Jörg Bergmann; Flickr <https://www.flickr.com/photos/gomera/38656195015/>; CC-BY –NC – ND 2.0 Generic.





# Biosignals for assessment of cybersickness

Assist. Prof. Nadica Miljković, PhD

Signals & systems department

University of Belgrade – School of Electrical Engineering

e-mail: [nadica.miljkovic@etf.bg.ac.rs](mailto:nadica.miljkovic@etf.bg.ac.rs)

URL: <https://bit.ly/2pvosx0>

