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Advancing movement & sleep research

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GGIR training: Day 1

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Slide deck version: 21 November 2023

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DECLARATION

- Our aim is to train you to use and understand GGIR for your research
- Focus on common use-cases of GGIR
- If you have questions? Feel free to post them in the chat, we will try to answer them during the course
- We will have 1-2 short breaks today
- We will **NOT** record the video session
- Please do **NOT** record this training and share publicly
- Slides are available as PDF => https://www.accelting.com/ggir-standard-training/

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What will we do today?

- Introduction to GGIR and accelerometers
- GGIR demo
- Lecture:
  - Using GGIR
  - Data quality
  - Acceleration metrics
  - Accounting for study protocol
  - Description of behaviour
  - GGIR Output
- Exercise
- Question time

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?

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Introduction to GGIR

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GGIR

R package for accelerometry

GGIR is an R-package to process multi-day raw accelerometer data for physical activity and sleep research.

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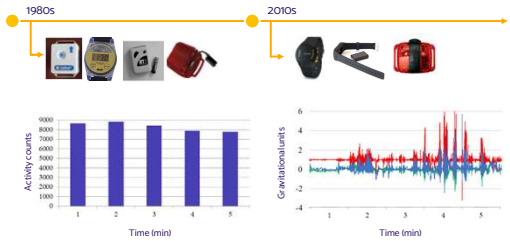
Accelerometry



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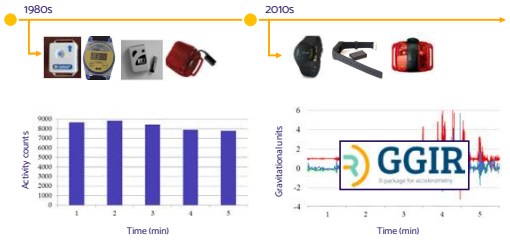
Accelerometry



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Accelerometry

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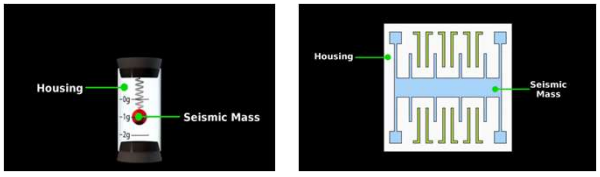
Accelerometry



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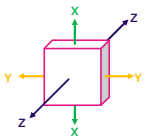
Raw data



X	Y	Z
-0.510	0.144	-0.850
-0.510	0.144	-0.845
-0.510	0.144	-0.850
-0.507	0.144	-0.845
-0.510	0.144	-0.850
-0.510	0.144	-0.845
-0.510	0.144	-0.845
-0.513	0.144	-0.842
-0.510	0.144	-0.845
-0.510	0.144	-0.845
-0.507	0.141	-0.845
-0.510	0.147	-0.845
-0.510	0.147	-0.845
-0.510	0.147	-0.842
-0.510	0.144	-0.845
-0.510	0.144	-0.842
-0.510	0.150	-0.842
-0.510	0.147	-0.845
-0.501	0.150	-0.845
-0.510	0.144	-0.845
-0.510	0.147	-0.850
-0.510	0.147	-0.845
-0.513	0.147	-0.842
-0.510	0.144	-0.842
-0.510	0.144	-0.845
-0.510	0.144	-0.845
-0.510	0.147	-0.842
-0.510	0.150	-0.845
-0.510	0.144	-0.842
-0.507	0.144	-0.845
-0.507	0.144	-0.845

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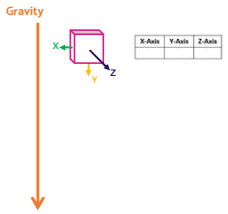
Raw data



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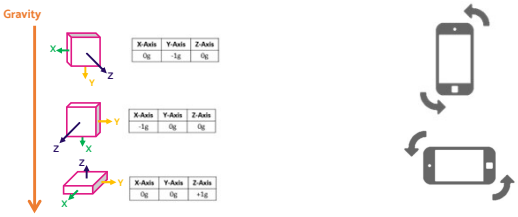
Raw data



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In-built functionality to read

- Axivity data (.cwa, .wav, and .csv)
- ActiGraph data (.gt3x and .csv)
- GENEActiv data (.bin)
- GENEA data (.bin)
- Movisens data (folder with inside .bin)

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And other csv files

- csv's with acceleration data independently of the Brand
- Flexible to variety of data formats

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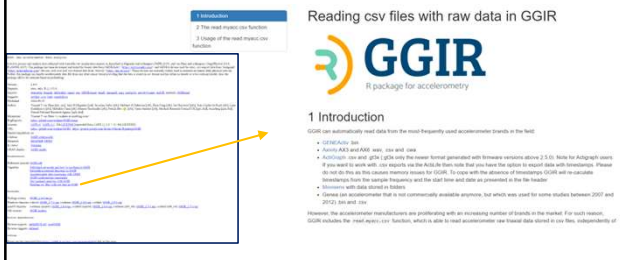
Online Tutorial



https://cran.r-project.org/web/packages/GGIR/vignettes/readmyacccsv.html

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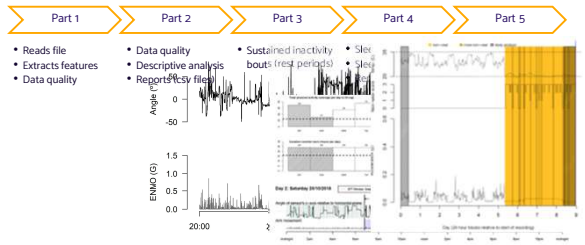
The GGIR pipeline



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One R command

Using all defaults:

```
library(GGIR)
GGIR(datadir="C:/mystudy/mydata",
     outputdir="D:/myresults")
```

Note:
- File paths are examples
- You can have data and output on different or on the same drive
- R uses forward slashes
- Argument datadir must differ from argument outputdir

Tailored to a study:

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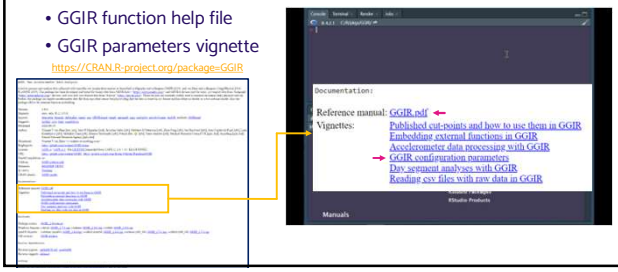
Arguments documentation

- GGIR function help file
- GGIR parameters vignette

https://CRAN.R-project.org/package=GGIR



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Vignette example

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Open-Source Software

- Increases reproducibility
- Increases transparency
- Supports community efforts to develop new methods

Strengths

Challenges

- Free software does not maintain itself. Therefore, maintenance depends on community.

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GGIR demo

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General arguments

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
    outputdir = "D:/myoutput",
    mode = c(1, 2, 3, 4, 5),
    studyname = "GGIRtraining",
    desiredtz = "", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel  = TRUE,
    [...]
    )
```

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
    outputdir = "D:/myoutput",
    mode = c(1, 2, 3, 4, 5),
    studyname = "GGIRtraining",
    desiredtz = "", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel  = TRUE,
    [...]
    )
```

mode

Numeric (default = 1:5). Specify which of the five parts need to be run, e.g., mode = 1 makes that g.part1 is run; or mode = 1:5 makes that the whole GGIR pipeline is run, from g.part1 to g.part5.

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
    outputdir = "D:/myoutput",
    mode = c(1, 2, 3, 4, 5),
    studyname = "GGIRtraining",
    desiredtz = "", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel  = TRUE,
    [...]
    )
```

studyname

Character (default = c()). If the datadir is a folder, then the study will be given the name of the data directory. If datadir is a list of filenames then the studyname as specified by this input argument will be used as name for the study.

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
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    mode = c(1, 2, 3, 4, 5),
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    desiredtz = "", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel  = TRUE,
    [...]
    )
```

desiredtz

Character (default = "", i.e., system timezone). Timezone in which device was configured and experiments took place. If experiments took place in a different timezone, then use this argument for the timezone in which the experiments took place and argument configtz to specify where the device was configured. See also http://en.wikipedia.org/wiki/Zone.tab

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
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    idloc = 2,
    overwrite = FALSE,
    do.parallel  = TRUE,
    [...]
    )
```

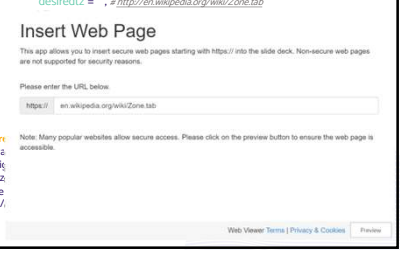

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
    outputdir = "D:/myoutput",
    mode = c(1, 2, 3, 4, 5),
    studyname = "GGIRtraining",
    desiredtz = "Europe/London", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel = TRUE,
    [...]
)
```

desiredtz

Character (default = "", i.e., system timezone). Timezone in which device was configured and experiments took place. If experiments took place in a different timezone, then use this argument for the timezone in which the experiments took place and argument configtz to specify where the device was configured. See also http://en.wikipedia.org/wiki/Zone.tab

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Running GGIR

General settings

idloc = 1

05_(6dias)CLE1B39120023 (2019-04-09).gt3x
06_CLE1B39120004 (2019-06-25).gt3x
08_MOS2D30160079 (2019-05-31).gt3x
09_MOS2D30160079 (2019-04-30).gt3x
011_NEO1F10120227 (2019-05-23).gt3x
013_CLE1B38120880 (2019-03-28).gt3x
015_CLE1B39120023 (2019-03-26).gt3x

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
    outputdir = "D:/myoutput",
    mode = c(1, 2, 3, 4, 5),
    studyname = "GGIRtraining",
    desiredtz = "Europe/London", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel = TRUE,
    [...]
)
```

idloc

Numeric (default: idloc = 1). If idloc = 1 the code assumes that ID number is stored in the obvious header field. Note that for ActiGraph data the ID is never stored in the file header. For value set to 2, 5, 6, and 7, GGIR looks at the filename and extracts the character string preceding the first occurrence of a '_' (idloc = 2), ' ' (space, idloc = 5), '.' (dot, idloc = 6), and '-' (idloc = 7), respectively. You may have noticed that idloc 3 and 4 are skipped, they were used for one study in 2012, and not actively maintained anymore, but because it is legacy code not omitted.

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Running GGIR

General settings

05_(6dias)CLE1B39120023 (2019-04-09).gt3x
06_CLE1B39120004 (2019-06-25).gt3x
08_MOS2D30160079 (2019-05-31).gt3x
09_MOS2D30160079 (2019-04-30).gt3x
011_NEO1F10120227 (2019-05-23).gt3x
013_CLE1B38120880 (2019-03-28).gt3x
015_CLE1B39120023 (2019-03-26).gt3x

```
GGIR(
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    desiredtz = "Europe/London", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel = TRUE,
    [...]
)
```

output_mystudy
- meta
  - basic
    - meta_05.RData
    - meta_06.RData
  - results
- config.csv
- ms2.out
- ms3.out
- ms4.out
- ms5.out

overwrite

Boolean (default = FALSE). Do you want to overwrite analysis for which milestone data exists? If overwrite=FALSE, then milestone data from a previous analysis will be used if available and visual reports will not be created again.

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Running GGIR

General settings

```
GGIR(
    # general settings
    datadir = "C:/mystudy/mydata",
    outputdir = "D:/myoutput",
    mode = c(1, 2, 3, 4, 5),
    studyname = "GGIRtraining",
    desiredtz = "Europe/London", # http://en.wikipedia.org/wiki/Zone.tab
    idloc = 2,
    overwrite = FALSE,
    do.parallel = TRUE,
    [...]
)
```

do.parallel

Boolean (default = TRUE). whether to use multi-core processing (only works if at least 4 CPU cores are available).

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What are modern acceleration sensors sensitive to?

(Multiple choice)

- ❑ Gravitational acceleration
- ❑ Heart rate
- ❑ Vibrations
- ❑ Angular velocity
- ❑ Accelerations due to body movement
- ❑ Orientation relative to north pole

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What are modern acceleration sensors sensitive to?

(Multiple choice)

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- ☑ Vibrations
- ❑ Angular velocity
- ☑ Accelerations due to body movement
- ❑ Orientation relative to north pole

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Which arguments/parameters do we **ALWAYS** need to specify? *(Multiple choice)*

- ❑ mode
- ❑ datadir
- ❑ desiredtz
- ❑ idloc
- ❑ outputdir
- ❑ studyname

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Which arguments/parameters do we **ALWAYS** need to specify? *(Multiple choice)*

- ❑ mode
- ☑ datadir
- ❑ desiredtz
- ❑ idloc
- ☑ outputdir
- ❑ studyname

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Data quality

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The GGIR pipeline

Part 1	Part 2	Part 3	Part 4	Part 5
• Reads file • **Data quality** • Extracts features	• **Data quality** • Descriptive analysis • Reports (csv files)	• Sleep analysis • Sustained inactivity periods	• Sleep analysis • Sleep period time • Reports (csv files)	• Full-day time-use análisis • Reports (csv files)

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Data quality

- **Calibration of the accelerations**
- Nonwear detection

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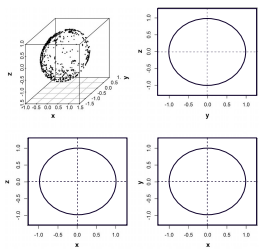
Sensor auto-calibration in GGIR

- Acceleration sensors are calibrated to *g* in factory.
- Calibration may be imperfect



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Sensor auto-calibration in GGIR

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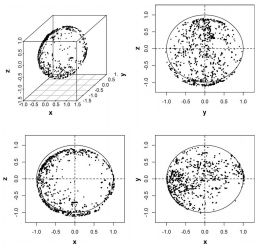
- Calibration may be imperfect



Autocalibration of accelerometer data for free-living physical activity assessment using local gravity and temperature: an evaluation on four continents

van Hees et al. 2014, doi: 10.1152/japplphysiol.00421.2014

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Data quality

- Calibration of the accelerations
- **Nonwear detection**

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Non-wear time detection

```
GGIR(# general settings
  [...]
  # data quality and metrics
  windowsizes = c(5, 900, 3600),
  nonwear_approach = "2013",
  [...])
```

1. Standard deviation per axis per time window [1]
   - IF in at least 2 sensor axes:
     - standard deviation per hour [3600 seconds] ≈ noise (noise threshold specific for each brand)
     - Difference between minimum and maximum value < threshold
   - THEN:
     - Classification => not worn
2. In 2013 [2] enhanced with:
   - Overlapping windows (default = 15 min [900 seconds])
   - Filter out 'wear' surrounded by a lot of non-wear [2]

1. van Hees et al. 2011, doi: 10.1371/journal.pone.0022922
2. van Hees et al. 2013, doi: 10.1371/journal.pone.0061691 (in supplementary material)

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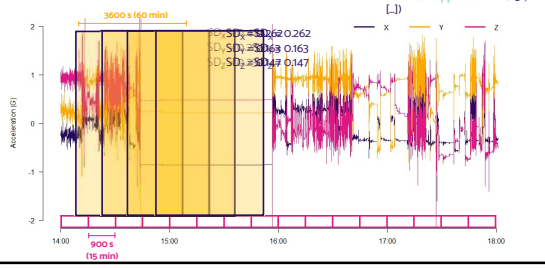
Non-wear time detection

Device noise = 13 *mg* (0.013 *g*)

```
GGIR(# general settings
  [...]
  # data quality and metrics
  windowsizes = c(5, 900, 3600),
  nonwear_approach = "2013",
  [...])
```



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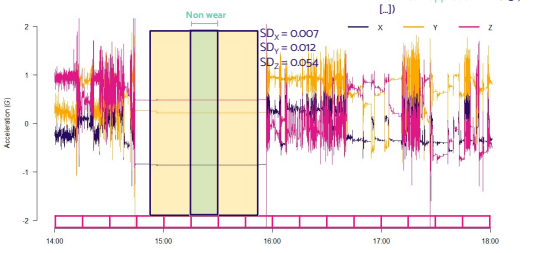
Non-wear time detection

Device noise = 13 *mg* (0.013 *g*)

```
GGIR(# general settings
  [...]
  # data quality and metrics
  windowsizes = c(5, 900, 3600),
  nonwear_approach = "2013",
  [...])
```



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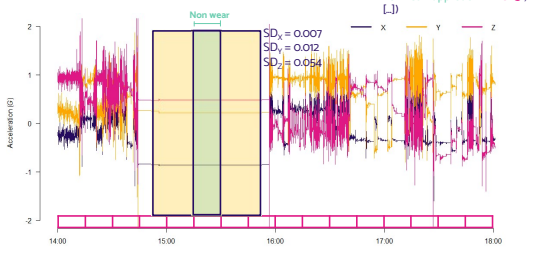
Non-wear time detection

Device noise = 13 *mg* (0.013 *g*)

```
GGIR(# general settings
  [...]
  # data quality and metrics
  windowsizes = c(5, 900, 3600),
  nonwear_approach = "2023",
  [...])
```



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The GGIR()

Data quality

```
GGIR(
    [...]
    windowsizes = c(5, 900, 3600),
    nonwear_approach = "2023",
    [...])
```

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The quality check of the data performed in GGIR includes... *(Multiple choice)*

- ❑ Evaluation of the calibration of the sensor
- ❑ Non-wear time detection
- ❑ Detect whether the sensor is worn on the right location
- ❑ Detect that the sensor recorded in the expected sampling frequency

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The quality check of the data performed in GGIR includes... *(Multiple choice)*

- ☑ Evaluation of the calibration of the sensor
- ☑ Non-wear time detection
- ❑ Detect whether the sensor is worn on the right location
- ❑ Detect that the sensor recorded in the expected sampling frequency

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Acceleration metrics

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The GGIR pipeline

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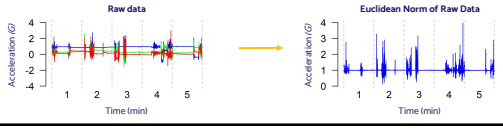
Euclidean Norm

X	Y	Z
-0.510	0.144	-0.850
-0.510	0.144	-0.845
-0.510	0.144	-0.850
-0.507	0.144	-0.845
-0.510	0.144	-0.850
-0.510	0.144	-0.845
-0.510	0.144	-0.845
-0.513	0.144	-0.842
-0.510	0.144	-0.845
-0.510	0.144	-0.845

EN
1.002
0.997
1.002
0.996
1.002
0.997
0.997
0.996
0.997
0.997

Euclidean Norm (Vector Magnitude)

$$EN = \sqrt{x^2 + y^2 + z^2}$$



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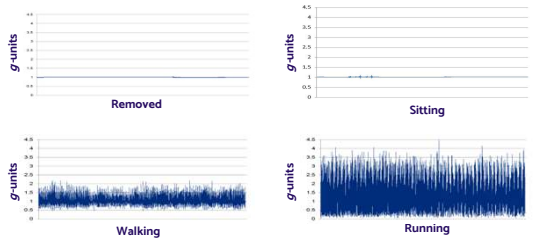
Euclidean Norm



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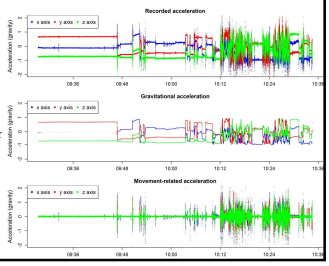
Metrics in GGIR

- Key: Separate gravitational from movement-related acceleration
- For example orientation of the z-axis (z-angle):

$$\left(\tan^{-1}\frac{acc_{z\_rollmedian}}{\sqrt{acc_{x\_rollmedian}{}^2 + acc_{y\_rollmedian}{}^2}}\right) \cdot 180/\pi$$

Blog post:

Ten Misunderstandings surrounding Information Extraction from Wearable Accelerometer data



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Default ENMO metric in GGIR

Formula:

$$\max\left\{\sqrt{acc_x{}^2 + acc_y{}^2 + acc_z{}^2} - 1{,}0\right\}$$

Broken down:

1. Euclidean norm:
   $$EN = \sqrt{x^2 + y^2 + z^2}$$
2. Substract 1*g*: $EN - 1$
3. **when** (EN – 1) < 0 **replace by** 0
4. $g \rightarrow mg$
5. Average per epoch

	Accelerometer X	Accelerometer Y	Accelerometer Z	Euclidean Norm	Euclidean Norm Minus One	ENMO	ENMO_mg	ENMO_1s_mg
2	-0.791	-0.253	0.548	0.995	-0.005	0.000	0.000	4.147
3	-0.794	-0.251	0.545	0.996	-0.004	0.000	0.000	
4	-0.805	-0.253	0.551	1.008	0.008	0.008	8.156	
5	-0.797	-0.251	0.545	0.998	-0.002	0.000	0.000	
6	-0.794	-0.253	0.542	0.994	-0.006	0.000	0.000	
7	-0.797	-0.245	0.545	0.997	-0.003	0.000	0.000	
8	-0.797	-0.256	0.542	0.998	-0.002	0.000	0.000	
9	-0.660	-0.483	0.551	0.991	-0.009	0.000	0.000	
10	-0.557	-0.548	0.655	1.019	0.019	0.019	19.450	
11	-0.531	-0.539	0.675	1.014	0.014	0.014	13.864	
12	-0.516	-0.600	0.614	1.001	0.001	0.001	1.418	4.579
13	-0.575	-0.571	0.587	1.000	0.000	0.000	0.381	
14	-0.545	-0.589	0.576	0.988	-0.012	0.000	0.000	
15	-0.575	-0.586	0.573	1.001	0.001	0.001	0.908	
16	-0.528	-0.618	0.563	0.989	-0.011	0.000	0.000	
17	-0.548	-0.612	0.584	1.008	0.008	0.008	7.644	
18	-0.619	-0.481	0.655	1.021	0.021	0.021	20.926	
19	-0.572	-0.236	0.784	0.998	-0.002	0.000	0.000	
20	-0.805	-0.423	0.649	1.015	0.015	0.015	14.534	
21	-0.773	-0.452	0.419	0.989	-0.011	0.000	0.000	
22	-0.798	-0.408	0.497	0.977	-0.023	0.000	0.000	5.406
23	-0.776	-0.446	0.493	1.022	0.022	0.022	22.204	
24	-0.779	-0.455	0.451	1.009	0.009	0.009	8.912	
25	-0.773	-0.464	0.425	0.997	-0.003	0.000	0.000	
26	-0.817	-0.331	0.487	1.001	0.001	0.001	1.191	
27	-0.807	-0.251	0.419	0.995	-0.005	0.000	0.000	
28	-0.773	-0.493	0.227	0.944	-0.056	0.000	0.000	
29	-0.976	-0.302	0.009	1.022	0.022	0.022	21.751	

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Acceleration metrics in GGIR

Magnitude-based removal of gravity
- ENMO
- ENMOa
- LFENMO

No attempt to remove gravity
- EN
- LF_x, LF_y, LF_z
- LFEN

Frequency-content based removal of gravity
- BFEN, BF_x, BF_y, BF_z
- HFEN, HF_x, HF_y, HF_z
- $HFEN_+$
- MAD
- (Brond counts)
- Neishabouri counts

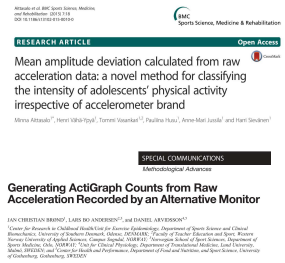
Zero-crossing
- Zero-crossing counts
  - ZC_x, ZC_y, ZC_z

64

Literature about metrics in GGIR

PLOS ONE

Separating Movement and Gravity Components in an Acceleration Signal and Implications for the Assessment of Human Daily Physical Activity



BMC Sports Science, Medicine & Rehabilitation

RESEARCH ARTICLE Open Access

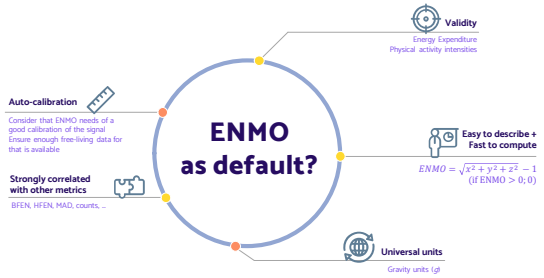
Mean amplitude deviation calculated from raw acceleration data: a novel method for classifying the intensity of adolescents' physical activity irrespective of accelerometer brand

SPECIAL COMMUNICATIONS
Methodological Advances

Generating ActiGraph Counts from Raw Acceleration Recorded by an Alternative Monitor

65

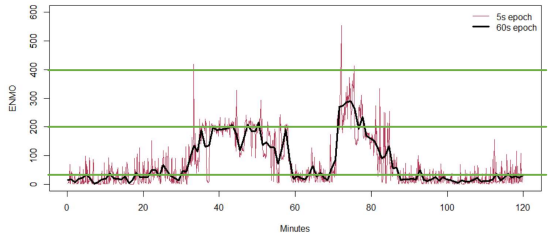
ENMO as default?



66

Epoch length

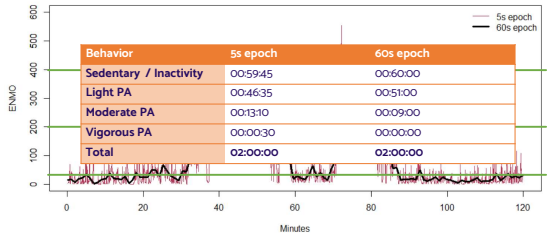
```
GGIR(# general settings
     [...]
     # data quality and metrics
     windowsizes = c(5, 900, 3600),
     [...])
```



68

Epoch length

```
GGIR(# general settings
     [...]
     # data quality and metrics
     windowsizes = c(5, 900, 3600),
     [...])
```



Behavior	5s epoch	60s epoch
Sedentary / Inactivity	00:59:45	00:60:00
Light PA	00:46:35	00:51:00
Moderate PA	00:13:10	00:09:00
Vigorous PA	00:00:30	00:00:00
Total	02:00:00	02:00:00

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Why do we aggregate per epoch?

- Reduces dependency on sampling frequency, which varies between studies
- Evidence on the value of raw accelerometer data primarily based on epoch aggregates

70

The GGIR()

Acceleration metrics

```
GGIR(
     [...]
     windowsizes = c(5, 900, 3600),
     do.enmo = TRUE,
     do.enmoa = FALSE,
     do.anglex = FALSE,
     do.angley = FALSE,
     do.anglez = TRUE,
     # [see all "do..." metrics]
     [...])
```

Accelting

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?

Select the windowsizes argument that defines a 15-second epoch for the accelerometer metrics aggreation *(Single choice)*

- ❑ c(5, 900, 15)
- ❑ c(5, 15, 3600)
- ❑ c(15, 900, 3600)
- ❑ c(900, 3600, 15)

72

?

Select the windowsizes argument that defines a 15-second epoch for the accelerometer metrics aggreation *(Single choice)*

- ❑ c(5, 900, 15)
- ❑ c(5, 15, 3600)
- ☑ c(15, 900, 3600)
- ❑ c(900, 3600, 15)

73

Study protocol

www.accelting.com

74

The GGIR pipeline

Part 1	Part 2	Part 3	Part 4	Part 5
• Reads file • Data quality • Extracts features	• Data quality • **Descriptive analysis** • Reports (csv files)	• Sleep analysis • Sustained inactivity periods	• Sleep analysis • Sleep period time • Reports (csv files)	• Full-day time-use analysis • Reports (csv files)

75

Need to select/mask data

- Non-wear detection may not be perfect
  - Accelerometer may be in the mail
  - Accelerometer may be left in a bag
  - Recording is expected to run longer than wear instruction
- Some days may be expected to include non-representative data
  - Participant is invited to come to the clinic

76

Available options in GGIR to select/mask data

- Exclude X hours from start
- Exclude X hours from end
- Exclude all data before first and after last midnight
- Exclude all data before first midnight
- Include X days with the highest activity levels
- Include only first X 24 hour blocks in data
- Include only first X calendar days

Set maximum number of days or calendar days

```
GGIR(
  [...]
  # Study protocol
  maxdur = 0,
  max_calendar_days = 0,
  [...])
```

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The GGIR()

Study protocol

Purpose: analyze all the data available (default)

```
GGIR(
  [...]
  # Study protocol
  strategy = 1,
  hrs.del.start = 0, hrs.del.end = 0,
  [...])
```

strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 1 means select data based on hrs.del.start and hrs.del.end.

Accelting

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The GGIR()

Study protocol

Purpose: Skip first and last day

```
GGIR(
  [...]
  # Study protocol
  strategy = 1,
  hrs.del.start = 0, hrs.del.end = 0,
  [...])
```

strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 1 means select data based on hrs.del.start and hrs.del.end.

Accelting

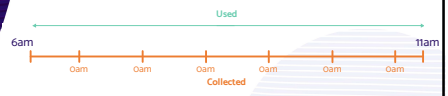
79

The GGIR()

Study protocol

Purpose: Skip first and last day

```
GGIR(
  [...]
  # Study protocol
  strategy = 1,
  hrs.del.start = 18, hrs.del.end = 11,
  [...])
```



strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 1 means select data based on hrs.del.start and hrs.del.end.

Accelting

80

The GGIR()

Study protocol

Purpose: Skip first and last day

```
GGIR(
  [...]
  # Study protocol
  strategy = 2,
  hrs.del.start = 18, hrs.del.end = 11,
  [...])
```

strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 2 makes that only the data between the first midnight and the last midnight is used.

Accelting

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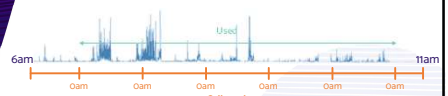
The GGIR()

Study protocol

Purpose: Handle study protocol when recording lasts longer than instructed wear period

```
GGIR(
  [...]
  # Study protocol
  strategy = 3,
  ndayswindow = 3,
  [...])
```



strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 3 only selects the most active X days in the file where X is specified by argument ndayswindow

Accelting

82

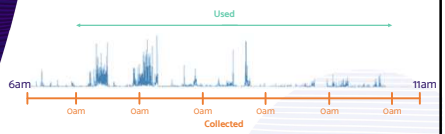
The GGIR()

Study protocol

Purpose: Handle study protocol when recording lasts longer than instructed wear period

```
GGIR(
  [...]
  # Study protocol
  strategy = 3,
  ndayswindow = 3,
  [...])
```

Assumption!
the days of data collection record higher activity than the other days



strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 3 only selects the most active X days in the file where X is specified by argument ndayswindow

Accelting

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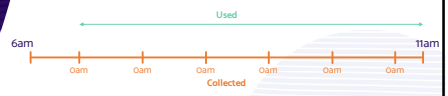
The GGIR()

Study protocol

Purpose: Skip only the first day

```
GGIR(
  [...]
  # Study protocol
  strategy = 4,
  [...])
```



strategy
Numeric (default = 1). How to deal with knowledge about study protocol.
strategy = 4 to only use the data after the first midnight.

Accelting

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Data cleaning

- How many hours should the device be worn to consider...
  - ✓a valid day? → includedaycrit
  - ✓a valid waking-hours window? → includedaycrit.part5
  - ✓a valid night? → includenightcrit

```
GGIR(
  [...]
  # Data cleaning
  includedaycrit = 16,
  includedaycrit.part5 = 0.667,
  includenightcrit = 16,
  [...])
```

87

The GGIR()

Study protocol

```
GGIR(
    [...]
    # Study protocol
    dayborder = 0,
    strategy = 1,
    hrs.del.start = 0, hrs.del.end = 0,
    ndayswindow = 7,
    includedaycrit = 16,
    [...])
```

Accelting

88

Imputation

www.accelting.com

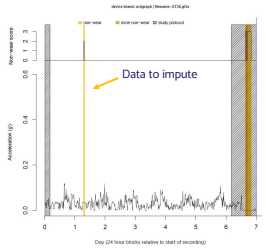
89

The GGIR pipeline

Part 1	Part 2	Part 3	Part 4	Part 5
• Reads file • Data quality • Extracts features	• Data quality • **Descriptive analysis** • Reports (csv files)	• Sleep analysis • Sustained inactivity periods	• Sleep analysis • Sleep period time • Reports (csv files)	• Full-day time-use analysis • Reports (csv files)

90

Imputation of invalid data points



91

Imputation of invalid data points

Scenario 1: Monitor was not worn on Thursday from 9:00 to 9:30 AM

	Mon	Tue	Wed	Thu	Fri	Sat	Sun	Avg
9:00:00 - 9:00:05	3	4	3	2.2	2	0	1	2.2
9:00:05 - 9:00:10	3	5	2	2	1	0	1	2
9:00:10 - 9:00:15	2	4	2	1.8	1	0	2	1.8
9:00:15 - 9:00:20	3	4	3	2.3	2	1	1	2.3
..	..	..	..	..	..	..	..	..
9:29:55 - 9:30:00	5	2	4	2.8	2	1		2.8

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Imputation of invalid data points

Scenario 2: Monitor was not worn any day from 9:00 to 9:30 AM

	Mon	Tue	Wed	Thu	Fri	Sat	Sun	Avg
9:00:00 - 9:00:05	0	0	0	0	0	0	0	0
9:00:05 - 9:00:10	0	0	0	0	0	0	0	0
9:00:10 - 9:00:15	0	0	0	0	0	0	0	0
9:00:15 - 9:00:20	0	0	0	0	0	0	0	0
..	..	..	..	..	..	..	..	..
9:29:55 - 9:30:00	0	0	0	0	0	0	0	0

Do you want to turn off the data imputation? →

```
GGIR(...)
    # data quality and metrics
    do.imp = FALSE,
    ...)
```

93

Physical activity & acceleration distribution

94

The GGIR pipeline

Part 1	Part 2	Part 3	Part 4	Part 5
• Reads file • Data quality • Extracts features	• Data quality • **Descriptive analysis** • Reports (csv files)	• Sleep analysis • Sustained inactivity periods	• Sleep analysis • Sleep period time • Reports (csv files)	• Full-day time-use analysis • Reports (csv files)

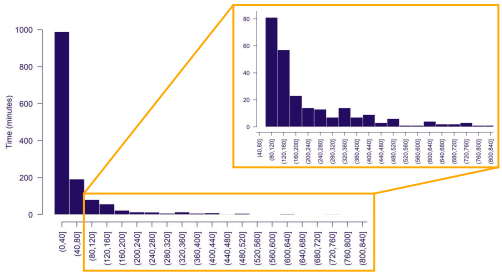
95

Acceleration distribution

- Quantiles
- Intensity levels
- Intensity gradient

96

Acceleration distribution

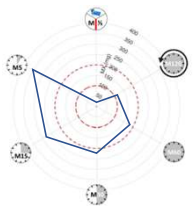


97

Acceleration distribution

- **Quantiles** → Percentiles of acceleration over the day (e.g., percentile 0.5 refers to 12 hours [i.e., 0.5 over 24 hours])
- Intensity levels
- Intensity gradient

MX metrics M120 = (24 − 2) / 24 ~ 0.917



98

Acceleration distribution

- **Quantiles** → Percentiles of acceleration over the day (e.g., percentile 0.5 indicates the acceleration threshold over the participants have spent half of the day [i.e., 12 hours])
- Intensity levels
- Intensity gradient

```
GGIR(
  [...]
  # Physical activity and acceleration distribution
  qlevels = c(0.5, 0.7, 0.9, 0.95),
  [...])
```

```
GGIR(
  [...]
  # Physical activity and acceleration distribution
  qlevels = c((24 − 2) / 24,   # M120
              (24 − 1) / 24),  # M60
  [...])
```

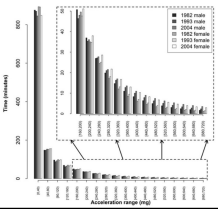
99

Acceleration distribution

- Quantiles
- **Intensity levels** → Time spent in intensity levels, e.g., c(0, 50, 100, 200, 8000)
- Intensity gradient


Original article

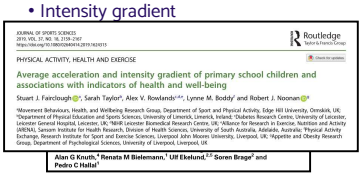
Physical activity levels in three Brazilian birth cohorts as assessed with raw triaxial wrist accelerometry



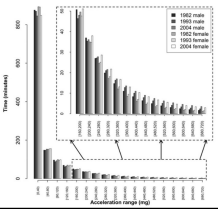
100

Acceleration distribution

- Quantiles
- **Intensity levels** → Time spent in intensity levels, e.g., c(0, 50, 100, 200, 8000)
- Intensity gradient


PHYSICAL ACTIVITY, HEALTH AND EXERCISE

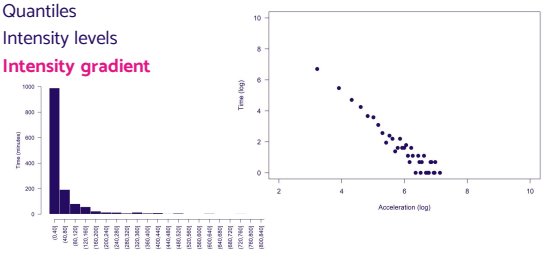
Average acceleration and intensity gradient of primary school children and associations with indicators of health and well-being



101

Acceleration distribution

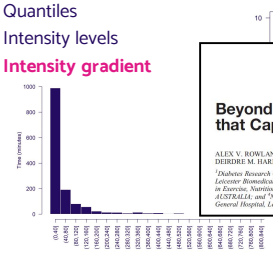
- Quantiles
- Intensity levels
- **Intensity gradient**

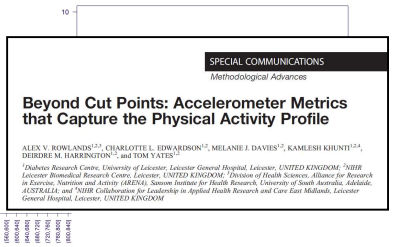


102

Acceleration distribution

- Quantiles
- Intensity levels
- **Intensity gradient**




SPECIAL COMMUNICATIONS

Methodological Advances

Beyond Cut Points: Accelerometer Metrics that Capture the Physical Activity Profile

ALEX V. ROWLANDS[1,2,3], CHARLOTTE L. EDWARDSON[1,2], MELANIE J. DAVIES[1,2], KAMLESH KHUNTI[1,2,4], DEIRDRE M. HARRINGTON[1,2], and TOM YATES[1,2]

103

Acceleration distribution

- Quantiles
- Intensity levels
- **Intensity gradient**

```
GGIR(
  [...]
  # Physical activity and acceleration distribution
  qlevels = c(0.5, 0.7, 0.9, 0.95),
  ilevels = c(0, 50, 100, 200, 8000),
  iglevels = 1,
  [...])
```

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The GGIR pipeline

Part 1	Part 2	Part 3	Part 4	Part 5
• Reads file • Data quality • Extracts features	• Data quality • **Descriptive analysis** • Reports (csv files)	• Sleep analysis • Sustained inactivity periods	• Sleep analysis • Sleep period time • Reports (csv files)	• **Full-day time-use analysis** • Reports (csv files)

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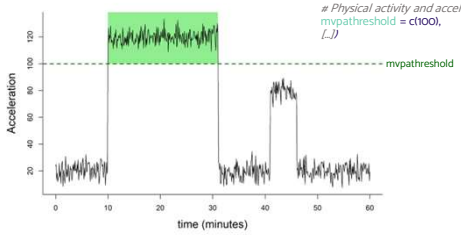
Physical activity in part 2

1. Time above threshold

```
GGIR(
  [...]
  # Physical activity and acceleration distribution
  mvpathreshold = c(100),
  [...])
```

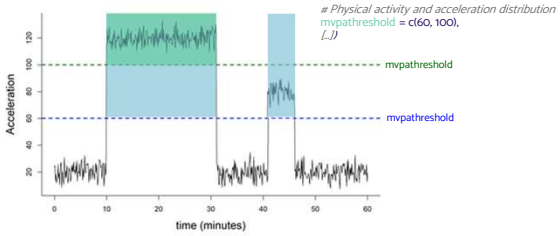


106

Physical activity in part 2

1. Time above threshold

```
GGIR(
  [...]
  # Physical activity and acceleration distribution
  mvpathreshold = c(60, 100),
  [...])
```



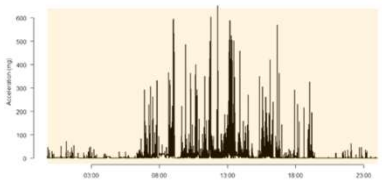
107

Windows definition

The argument **qwindow**

Numeric or character (default = c(0, 24)).

```
GGIR(
  [...]
  qwindow = c(0, 24),
  [...])
```



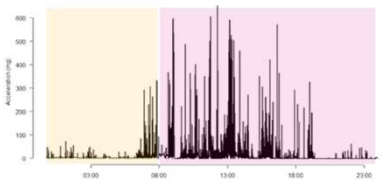
108

Windows definition

The argument **qwindow**

Numeric or character (default = c(0, 24)).

```
GGIR(
  [...]
  qwindow = c(0, 8, 24),
  [...])
```



109

Windows definition

The argument **qwindow**

Numeric or character.

If you want to use a day specific segmentation, then you can set qwindow to be the full path to activity diary file (csv file).

```
GGIR(
  [...]
  qwindow = "C:/mystudy/activitylog.csv",
  [...])
```

ID	Date	PE_1	PE_2	Date	PE_1	PE_2
ID01	20-01-2022	09:00:00	10:00:00	21-01-2022		
ID02	22-01-2022	11:30:00	12:30:00	23-01-2022	09:00:00	10:00:00
ID03	02-02-2022			03-02-2022	10:00:00	11:00:00
ID04	15-01-2022	09:00:00	10:00:00	16-01-2022		
ID05	04-02-2022			05-02-2022	11:30:00	12:30:00

Will only get the 24h indicators

110

What argument allows to analyse the data from different segments in the day? *(Single choice)*

- ❑ g.segments
- ❑ acc_intervals
- ❑ qwindow
- ❑ qlevels

111

What argument allows to analyse the data from different segments in the day? *(Single choice)*

- ❑ g.segments
- ❑ acc_intervals
- ☑ qwindow
- ❑ qlevels

112

What argument allows to extract percentiles of acceleration? *(Single choice)*

- ❑ g.segments
- ❑ acc_intervals
- ❑ qwindow
- ❑ qlevels

113

What argument allows to extract percentiles of acceleration? *(Single choice)*

- ❑ g.segments
- ❑ acc_intervals
- ❑ qwindow
- ☑ qlevels

114

The GGIR()

Physical activity & distribution

```
GGIR(
  [...]
  # Physical activity and acceleration distribution
  qlevels = c(0.5, 0.7, 0.9, 0.95),
  ilevels = c(0, 50, 100, 200, 8000),
  iglevels = 1,
  mvpathreshold = 100,
  mvpadur = c(1, 5, 10),
  boutcriter = 0.8,
  qwindow = c(0,24),
  [...])
```

Accelting

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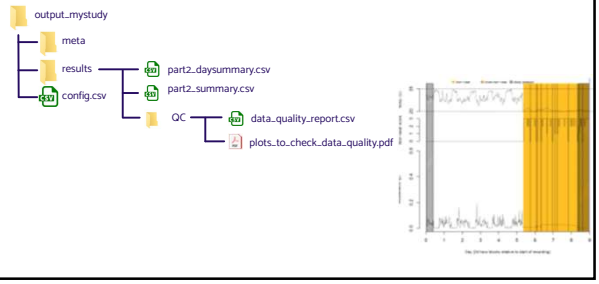
GGIR output part 2



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Assignment 1

1. Open RStudio and an empty script
2. Create a GGIR function call
3. Define datadir and outputdir
   - Tip 1: datadir should specify the path to out demo file
   - Tip 2: outputdir should be an existing folder (different to datadir)
4. Define mode to run GGIR parts 1 and 2
5. Make sure you only analyse data from the first midnight onwards
6. We are only interested in the analysis of the first 3 days.
7. Run the script via the source button
8. Advanced: Look up the output and meaning of variables
9. Optional: Try to run GGIR parts 1 and 2 on your own data

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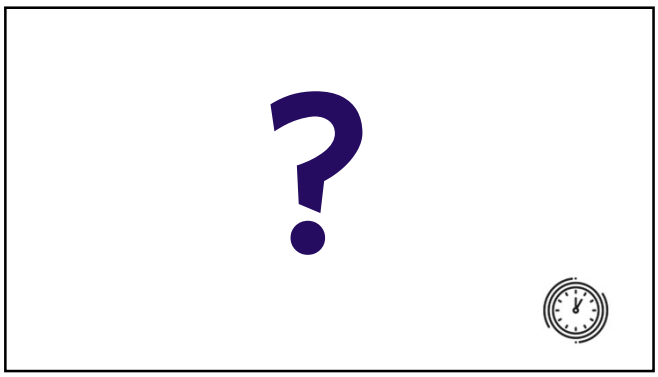

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Day
Evaluation

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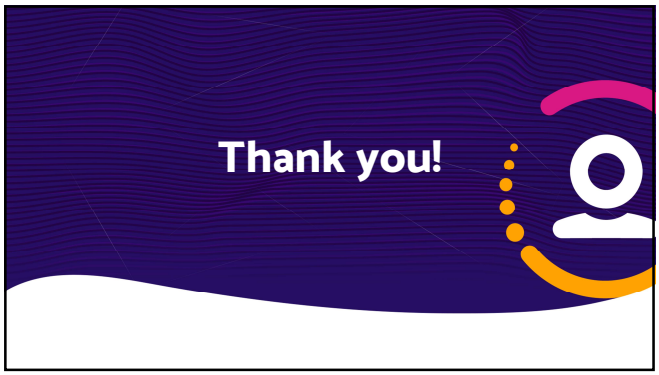

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