

Measuring Accessibility using R

As measuring accessibility required significant data processing, we will use a pre-prepared set of data and code (R language) in the form of a tutorial.

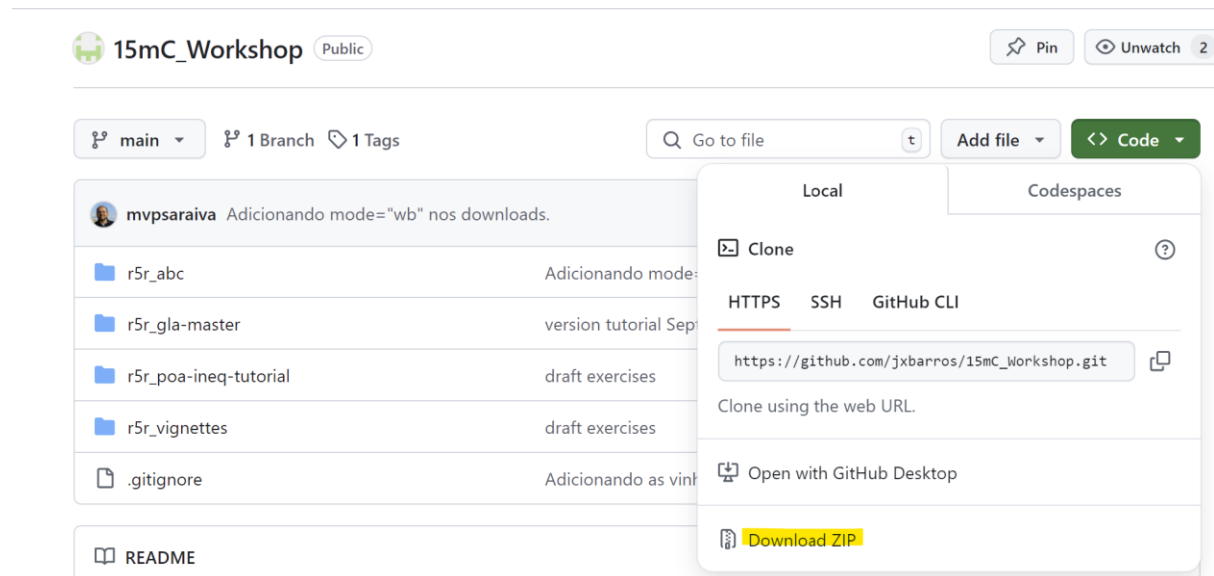
This tutorial will take you through the various stages of computing an accessibility metric without requiring programming knowledge or technical skills on data management.

There tutorials are available to download from GitHub.

If you are using your own computer, you will need to install the required software before starting.

To download the tutorial materials, go to https://github.com/jxbarros/15mC_Workshop/

The click on Code download, then select Download the Zip file.



Extract all files into your computer. Open the folder.

Before we start, **we need to install the 5r5 package and the JAVA Development Kit 21.**

We will do that via RStudio, by following the instructions at <https://github.com/ipeaGIT/r5r/>

Copy each of the lines below, and paste it in the RStudio console, then click ENTER.

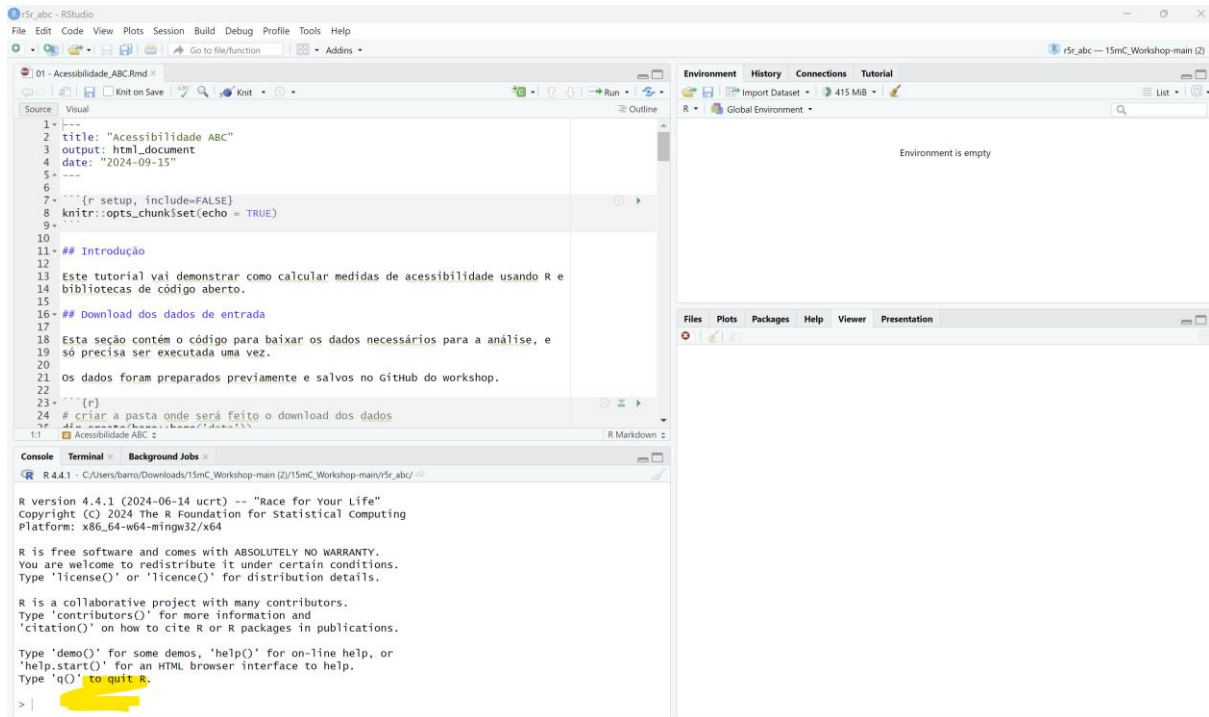
Once the code runs, you can copy the next line and do the same thing.

```
install.packages("r5r")
utils::remove.packages('r5r')
devtools::install_github("ipeaGIT/r5r", subdir = "r-package")
install.packages('rJavaEnv')
# check version of Java currently installed (if any)
```

```
rJavaEnv::java_check_version_rjava()
```

```
# install Java 21
```

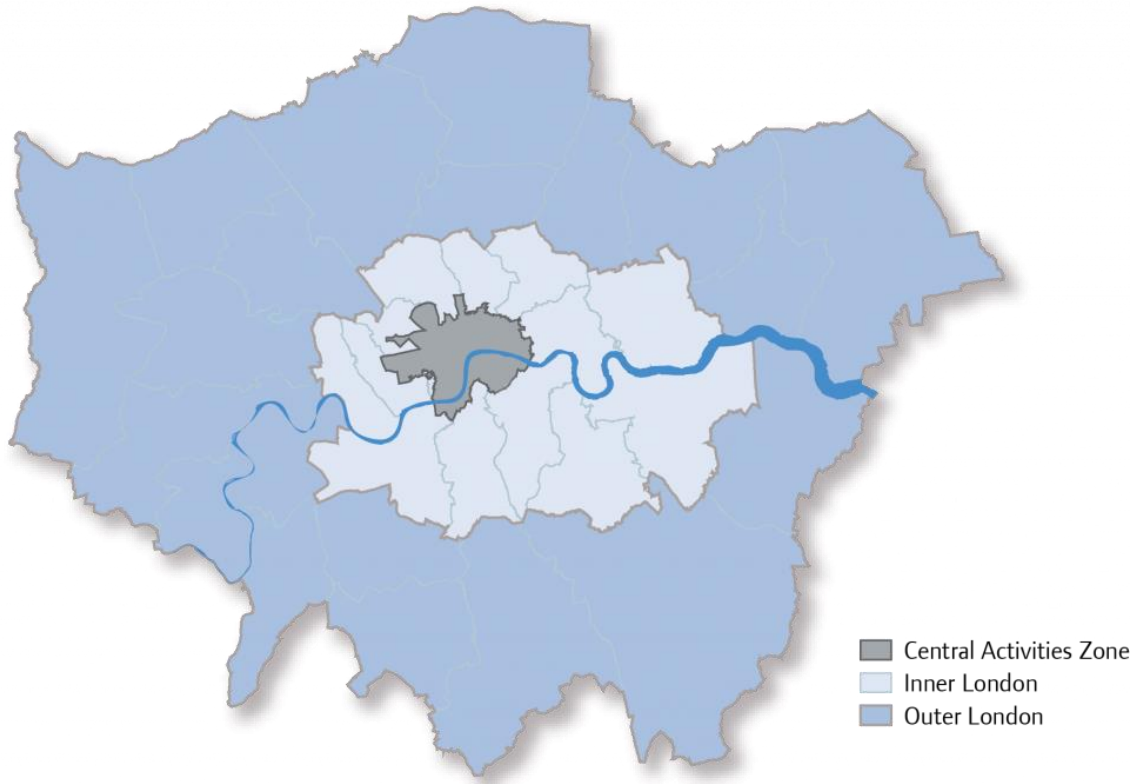
```
rJavaEnv::java_quick_install(version = 21)
```



We are now ready to start the tutorial.

1. London Tutorial

The tutorial will use data a reduced dataset that only covers part of the GLA: called inner-London (see map below). This will allow you to compute the metric using the workstation room computers.



© Crown Copyright and database right 2013. Ordnance Survey 100032216 GLA.

Image showing inner and outer London. Source: <https://www.london.gov.uk/file/3971128>

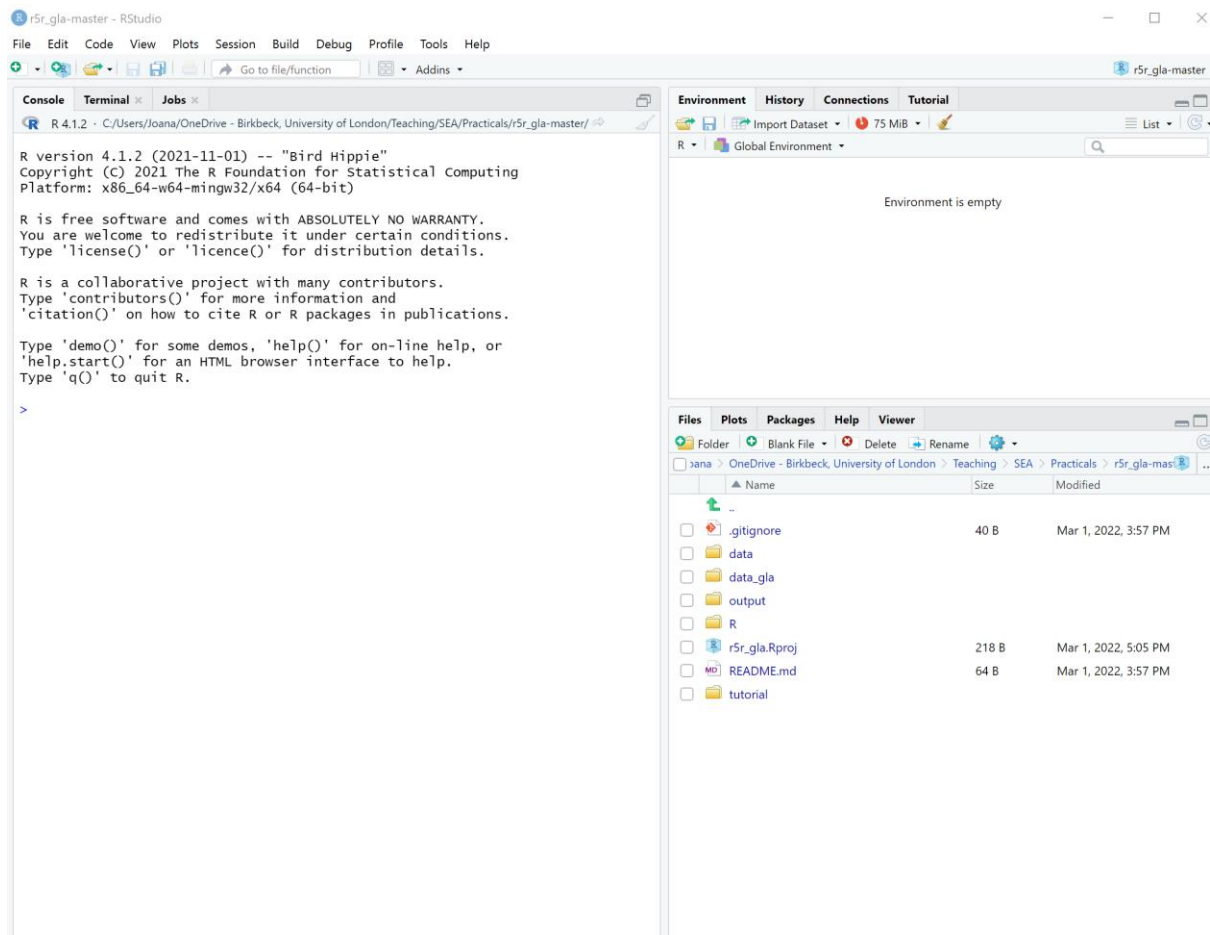
As you will need the results for the entire GLA for your assessment, a set of results is available and have been saved in the 'output' folder that you will download together with the tutorial (see below).

These include the cumulative accessibility using cut-off times (30, 60 and 90 min) for the following transport modes: walk, bike, bus, and transit.

To open the London tutorial, click on r5r.gla (R project):

| Name | Status | Date modified | Type | Size |
|------------|--------|------------------|----------------|------|
| data | ✓ | 01/03/2022 15:57 | File folder | |
| data_gla | ✓ | 01/03/2022 15:57 | File folder | |
| output | ✓ | 01/03/2022 15:57 | File folder | |
| R | ✓ | 01/03/2022 15:57 | File folder | |
| tutorial | ✓ | 01/03/2022 15:57 | File folder | |
| .gitignore | ✓ | 01/03/2022 15:57 | GITIGNORE File | 1 KB |
| r5r.gla | ✓ | 01/03/2022 15:57 | R Project | 1 KB |
| README.md | ✓ | 01/03/2022 15:57 | MD File | 1 KB |

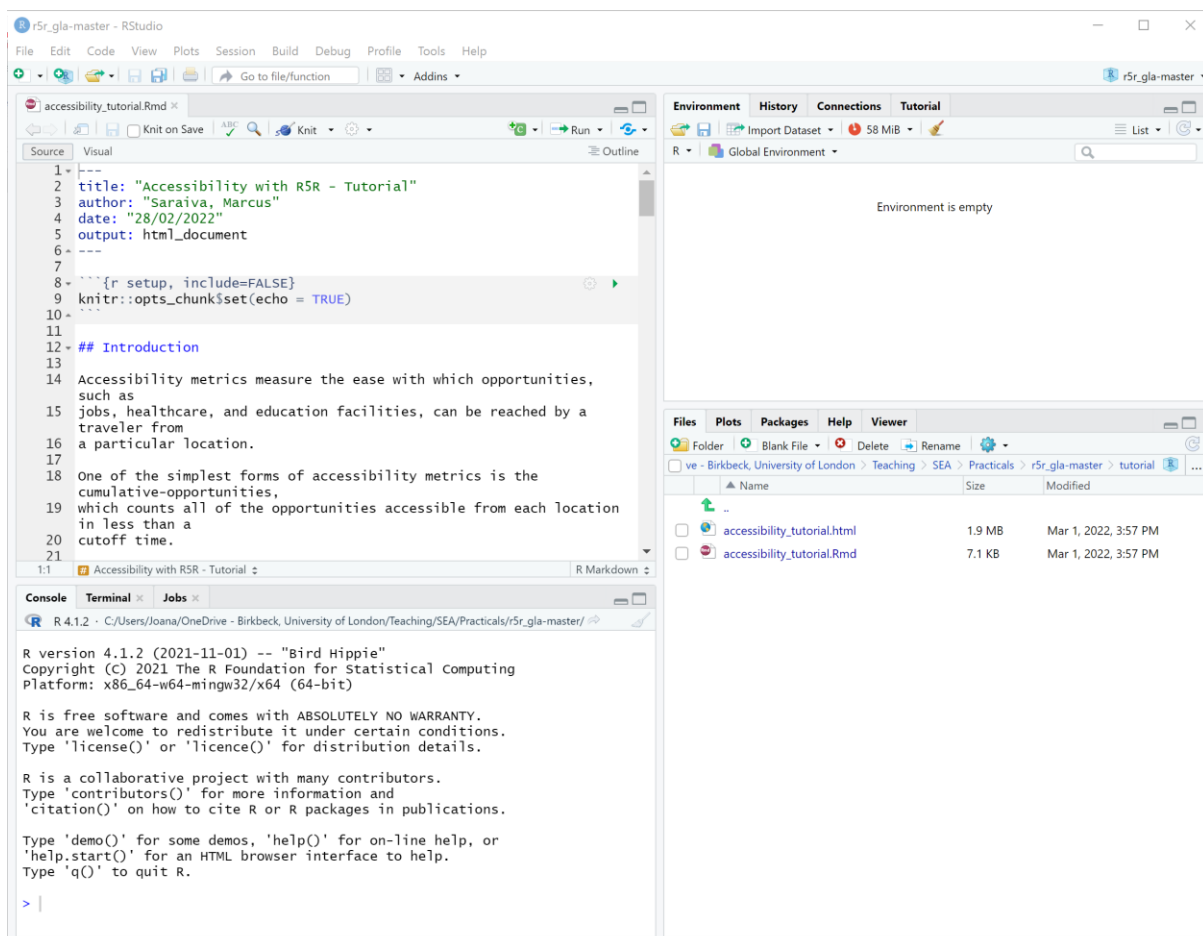
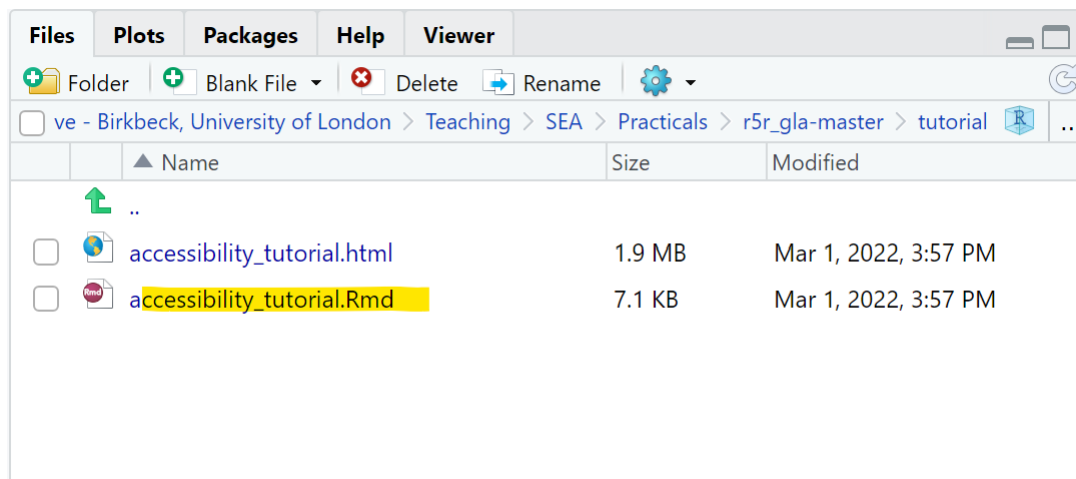
The R project will open in RStudio:



Before starting, make sure you have installed the required packages. If you are unsure, copy the following lines into the console part of RStudio and press enter:

```
install.packages("r5r")
install.packages("tidyverse")
install.packages("data.table")
install.packages("rgdal")
install.packages("rgeos")
install.packages("sf")
install.packages("mapview")
install.packages("leaflet")
install.packages("piggyback")
install.packages("devtools")
install.packages("oapdata")
install.packages("quantreg")
install.packages("geobr")
```

Now open the tutorial folder and click on the accessibility_tutorial.Rmd file:



If you get a message saying an additional library is required, **accept** the suggested installation.

The accessibility_tutorial.Rmd file contains information, instructions (text) as well as pieces of code you will run to calculate accessibility for Inner London.

You are not required to understand the programming language. The text will provide you with the information you need to know. If you are not familiar with R language, you will not understand the code, but this is not a problem as the focus here is accessibility!

Scroll down and read the text. Stop when you get to the parts that contain code. You will see a green arrow on the right-hand side of the code.

You must click on the green arrows to run each piece of code. Read the text and try to make sense of what the code is doing.

If you are doing this alone at home, make note of your questions so you can ask Joana later.

If you are in class with the group, we will be going through the tutorial together and you can raise your questions to the tutor immediately.

At the end of the tutorial, there are suggestions on changes to try, so you can measure accessibility using different travel modes, cut-off times, or at different times of the day.

This is done by changing the parameters of the accessibility function in the code. In order to find out the possible parameters for the accessibility function, **put the cursor on the accessibility function and click F1**. All options will appear on the help window. Note that those are the parameters that can be calculated using this code, but this depends on the information available on the GTSF dataset used.

These are not mandatory but will allow you to explore different aspects of accessibility and gain confidence with using the code.








Don't worry if something goes wrong. You can use *control+z* to go back on changes. In the worst-case scenario, you will need to download the folder from GitHub again, but this is not a big deal!

Also, don't worry if you get a lot of warning (red) messages – these should not be a problem. See examples of error/warning messages at the end of this document.

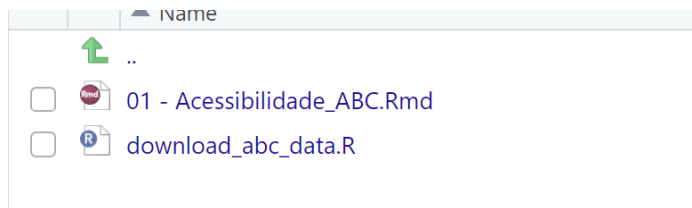
2. ABC Tutorial

We will now look at a similar exercise using the ABC (Santo André, São Bernardo do Campo and Sao Caetano do Sul) as case study.

Go to the r5r_abc folder and open the project of the same name.

| <input type="checkbox"/> Name | Date modified | Type | Size |
|---|------------------|----------------|----------|
|  .Rproj.user | 06/09/2024 10:22 | File folder | |
|  data | 15/09/2024 18:17 | File folder | |
|  R | 15/09/2024 18:02 | File folder | |
|  .gitignore | 06/09/2024 10:21 | GITIGNORE File | 1 KB |
|  .RData | 15/09/2024 14:52 | RDATA File | 5,272 KB |
|  .Rhistory | 17/09/2024 09:17 | RHISTORY File | 17 KB |
| <input checked="" type="checkbox"/>  r5r_abc | 17/09/2024 10:09 | R Project | 1 KB |

Once the project opens in RStudio, click into R and open the tutorial by clicking on the Accessibility_ABC.Rmd file:



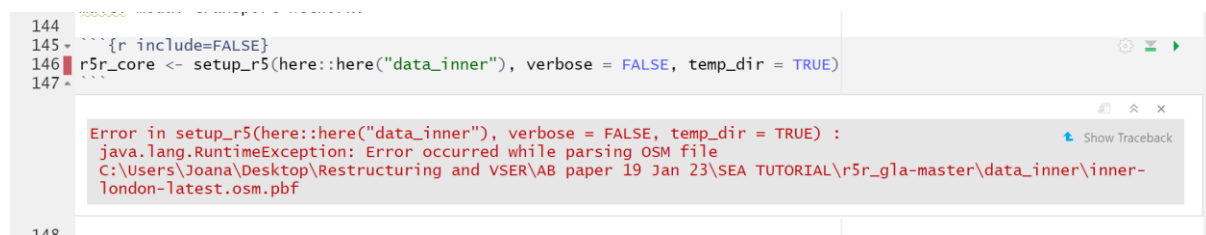
Possible errors messages and warnings:

It is likely you will see various error and warning messages (see examples below). As long as the task is completed, you can ignore those messages.

```
}
13:30:51.202 [main] ERROR com.conveyal.r5.streets.StreetLayer - Continuing to load but ignoring generalized costs due to exception: java.lang.RuntimeException: All ways are expected to have generalized cost tags. Missing: slope_1:forward
Mar 04, 2023 1:31:03 PM org.hsqldb.persist.Logger logInfoEvent
INFO: dataFileCache open start
13:31:04.118 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 149905, does not have from, to and via, skipping
13:31:04.142 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 1829708, does not have from, to and via, skipping
13:31:04.143 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 1829709, does not have from, to and via, skipping
13:31:04.151 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 2441789, no way from from to to via via, skipping
13:31:04.201 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 3845561, does not have from, to and via, skipping
13:31:04.227 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 5615179, does not have from, to and via, skipping
13:31:04.239 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 6415295, no way from from to to via via, skipping
13:31:04.493 [main] ERROR com.conveyal.r5.streets.StreetLayer - Invalid turn restriction 13325973, does not have from, to and via, skipping
13:31:04.502 [main] ERROR com.conveyal.r5.streets.StreetLayer - Did not find from/to edges for restriction 13569989, skipping
WARNING: An illegal reflective access operation has occurred
WARNING: Illegal reflective access by com.esotericsoftware.kryo.util.UnsafeUtil (file:/C:/Users/Joana/AppData/Local/Temp/RtIA5puEN/r5-v6.4-all.jar) to constructor java.nio.DirectByteBuffer(long,int,java.lang.Object)
WARNING: Please consider reporting this to the maintainers of com.esotericsoftware.kryo.util.UnsafeUtil
WARNING: Use --illegal-access=warn to enable warnings of further illegal reflective access operations
WARNING: All illegal access operations will be denied in a future release

Finished building network.dat at C:/Users/Joana/Desktop/Restructuring and VSER/AB paper 19 Jan 23/SEA TUTORIAL/r5r_gla-master/data_inner/network.dat
```

The error below is a common one, and it is due to an issue with the downloaded file (inner-london-latest.osm.pbf) which is very large and often gets corrupted due to issues in the download process.



The solution is to download the file again from:

<https://drive.google.com/file/d/1zuQOPL21U5ueicW4Rr3ApNUWTH0FRoH-/view?usp=sharing>

Check the file has the correct size, like in the picture below:

inner-london-latest.osm.pbf 04/03/2023 13:13 PBF File 41,799 KB

Another possible error is due to a bug on the r5r package, which has been fixed this week. If you get the following error when running the code in the lines 131-132 of the code, it is likely you need to reinstall the package and restart the tutorial.


```

121
122 - ## Calculating and visualising accessibility
123
124 - ### Build R5 multi-modal network
125
126 Finally, we can use the `setup_r5` function from `r5r` to build a routing network
127 and load it into memory. The `r5r_core` object returned by `setup_r5` contains
128 all we need for the next steps.
129 The code will combine the data on the road network and the schedule from public transport data (GTFS) to produce a
130 multi-modal transport network.
131
132 {r include=FALSE}
133 r5r_core <- setup_r5(here::here("data_inner"), verbose = FALSE, temp_dir = TRUE)
134
135 - ## Calculating accessibility
136
137 Now that everything is in place, we can compute accessibility to jobs with a
138

```

Error in setup_r5(here::here("data_inner"), verbose = FALSE, temp_dir = TRUE) :
java.lang.NullPointerException

Console Terminal Background Jobs

R 4.2.2 · C:/Users/Joana/Desktop/SEA TUTORIAL/r5r_gla-master/r5r_gla-master/

Geodetic CRS: WGS 84
First 10 features:

| | id | jobs | geom |
|----|-----------|--------|------------------------------|
| 1 | E02000001 | 356527 | POINT (-0.09041453 51.51426) |
| 2 | E02000166 | 2121 | POINT (-0.1540669 51.56412) |
| 3 | E02000167 | 2669 | POINT (-0.1728825 51.56106) |
| 4 | E02000168 | 4443 | POINT (-0.1409897 51.55487) |
| 5 | E02000169 | 1182 | POINT (-0.1848507 51.55616) |
| 6 | E02000170 | 1313 | POINT (-0.1997927 51.55366) |
| 7 | E02000171 | 1342 | POINT (-0.1573627 51.55168) |
| 8 | E02000172 | 4138 | POINT (-0.1462734 51.54933) |
| 9 | E02000173 | 9903 | POINT (-0.1718277 51.54978) |
| 10 | E02000174 | 2134 | POINT (-0.1343495 51.54846) |

```

> mapview(od_points_sf, zcol="jobs")
> r5r_core <- setup_r5(here::here("data_inner"), verbose = FALSE, temp_dir = TRUE)
No raster .tif files found. Using elevation = 'NONE'.
Downloading R5 jar file to C:/Users/Joana/AppData/Local/Temp/RtmpiE8tsN/r5-v6.8-all.jar
2023-03-04 16:32:49,437 [main] ERROR c.c.r.s.StreetLayer - Continuing to load but ignoring generalized costs due to exceptio
n: java.lang.RuntimeException: All ways are expected to have generalized cost tags. Missing: slope_1:forward
Error in setup_r5(here::here("data_inner"), verbose = FALSE, temp_dir = TRUE) :
  java.lang.NullPointerException
>

```

If the error persists, you can install the development version of r5r by using the following command:

```
devtools::install_github("ipeaGIT/r5r", subdir = "r-package")
```

Further tasks:

Open the accessibility results for the entire GLA in QGIS (shapefile available in the Output folder you downloaded from GitHub and also available in the SEA Moodle page).

Open the attribute table and look at the results.

Select at least 2 different travel modes and 2 cut-off times and create maps of the results.

Based on the instructions on how to create choropleth maps you used for the segregation indices, create maps using 'natural breaks' and 10 classes. Collate your maps in a word document and bring them to the class next week for discussion.

Links for manual download of key datasets:

<https://drive.google.com/file/d/1zuQOPL21U5ueicW4Rr3ApNUWTH0FRoH-/view?usp=sharing>

The file 'inner-london-latest.osm.pbf' will be downloaded

<https://data.bus-data.dft.gov.uk/timetable/download/gtfs-file/london>

The file itm_london_gtfs.zip will be downloaded.

Save both files in your data_inner folder. These will replace the versions of the files automatically downloaded.