Importing & transforming data

Mike Blazanin

2023-01-21

Contents

Workflow	1
Data layouts	2
Importing data	3
Importing block-shaped data	3
A basic example	3
Specifying metadata	6
Reading multiple blocks from a single file	7
Notes for more advanced use	9
What to do next	9
Importing wide-shaped data	9
A basic example	9
Specifying metadata	11
Reading multiple wides from a single file	12
What to do next	12
Importing tidy-shaped data	12
Transforming data	12
Transforming from wide-shaped to tidy-shaped	12
What's next?	13

Workflow

- 1. Introduction
- $2. \ \mathbf{Importing} \ \& \ \mathbf{transforming} \ \mathbf{data}$
- 3. Incorporating design information
- 4. Pre-processing and plotting your data
- 5. Processing your data

- 6. Analyzing your data
- 7. Statistics, merging other data, and other resources

If you haven't already, load the necessary packages.

library(gcplyr)

Data layouts

With that demonstration done, let's dig into some more details of how your input data might be organized and what gcplyr does. Growth curve data and design elements can be organized in one of three different tabular layouts: block-shaped, wide-shaped, and tidy-shaped, described below.

Tidy-shaped data is the best layout for analyses, but most plate readers output block-shaped or wide-shaped data, and most user-created design files will be block-shaped. Thus, gcplyr works by reshaping block-shaped into wide-shaped data, and wide-shaped data into tidy-shaped data, then running any analyses.

So, what are these three data layouts, and how can you tell which of them your data is in?

Block-shaped

In block-shaped data, the organization of the data corresponds directly with the layout of the physical multiwell plate it was generated from. For instance, a data point from the third row and fourth column of the data.frame will be from the well in the third row and fourth column in the physical plate. Because of this, a timeseries of growth curve data that is block-shaped will consist of many separate block-shaped data.frames, each corresponding to a single timepoint.

For example, here is a block-shaped data.frame of a 96-well plate (with "..." indicating Columns 4 - 10, not shown). In this example, all the data shown would be from a single timepoint.

	Column 1	Column 2	Column 3	 Column 11	Column 12
Row A	0.060	0.083	0.086	 0.082	0.085
Row B	0.099	0.069	0.065	 0.066	0.078
Row C	0.081	0.071	0.070	 0.064	0.084
Row D	0.094	0.075	0.065	 0.067	0.087
Row E	0.052	0.054	0.072	 0.079	0.065
Row F	0.087	0.095	0.091	 0.075	0.058
Row G	0.095	0.079	0.099	 0.063	0.075
Row H	0.056	0.069	0.070	 0.053	0.078

Wide-shaped

In wide-shaped data, each column of the dataframe corresponds to a single well from the plate, and each row of the dataframe corresponds to a single timepoint. Typically, headers contain the well names.

For example, here is a wide-shaped dataframe of a 96-well plate (here, "..." indicates the 91 columns A4 - H10, not shown). Each row of this dataframe corresponds to a single timepoint.

Time	A1	A2	A3	 H11	H12
0	0.060	0.083	0.086	 0.053	0.078
1	0.012	0.166	0.172	 0.106	0.156
2	0.024	0.332	0.344	 0.212	0.312
3	0.048	0.664	0.688	 0.424	0.624

Time	A1	A2	A3	 H11	H12
4	0.096	1.128	0.976	 0.848	1.148
5	0.162	1.256	1.152	 1.096	1.296
6	0.181	1.292	1.204	 1.192	1.352
7	0.197	1.324	1.288	 1.234	1.394

Tidy-shaped

In tidy-shaped data, there is a single column that contains all the plate reader measurements, with each unique measurement having its own row. Additional columns specify the timepoint, which well the data comes from, and any other design elements.

Note that, in tidy-shaped data, the number of rows equals the number of wells times the number of timepoints. For instance, with a 96 well plate and 100 timepoints, that will be 9600 rows. (Yes, that's a lot of rows! But don't worry, tidy-shaped data is the best format for downstream analyses.) Tidy-shaped data is common in a number of R packages, including ggplot, where it's sometimes called a "long" format. If you want to read more about tidy-shaped data and why it's ideal for analyses, see: Wickham, Hadley. Tidy data. The Journal of Statistical Software, vol. 59, 2014.

Timepoint	Well	Measurement
1	A1	0.060
1	A2	0.083
1	A3	0.086
7	H10	1.113
7	H11	1.234
7	H12	1.394

Importing data

Once you've determined what format your data is in, you can begin importing it using the read_* or import_* functions of gcplyr.

If your data is block-shaped: use import_blockmeasures and start in the next section: Importing block-shaped data

If your data is wide-shaped: use read_wides and skip down to the Importing wide-shaped data section

If your data is already tidy-shaped: use read_tidys and skip down to the Importing tidy-shaped data section.

Importing block-shaped data

To import block-shaped data, use the import_blockmeasures function. import_blockmeasures only requires a list of filenames (or relative file paths) and will return a wide-shaped data.frame that you can save in R.

A basic example

Here's a simple example. First, we need to create a series of example block-shaped .csv files. Don't worry how this code works. When working with real growth curve data, these files would be output by the

plate reader. All you need to do is put the file names in R in a vector, here we've stored the file names in temp_filenames.

```
#This code just creates a series of block-shaped example files
#Don't worry about how it works - when working with real growth
#curves data, all these files would be created by the plate reader
temp_filenames <-</pre>
  paste("Plate1-",
        paste(example_widedata$Time %/% 3600,
              formatC((example_widedata$Time %% 3600) %/% 60,
                      width = 2, flag = 0),
              formatC((example_widedata$Time %% 3600) %% 60,
                      width = 2, flag = 0),
              sep = "_"), ".csv", sep = "")
for (i in 1:length(temp_filenames)) {
  temp_filenames[i] <- strsplit(temp_filenames[i], split = "\\\")[[1]][</pre>
    length(strsplit(temp_filenames[i], split = "\\\")[[1]])]
for (i in 1:length(temp_filenames)) {
  write.table(
    cbind(
      matrix(c("", "", "", "", "A", "B", "C", "D", "E", "F", "G", "H").
             nrow = 12),
      rbind(rep("", 12),
            matrix(c("Time", example_widedata$Time[i], rep("", 10)), ncol = 12),
            rep("", 12),
            matrix(1:12, ncol = 12),
            matrix(
              (example_widedata[i, 2:ncol(example_widedata)]/(5*10**8)),
              ncol = 12))
   ),
   file = temp_filenames[i], quote = FALSE, row.names = FALSE, sep = ",",
    col.names = FALSE)
}
```

If you've saved all the files to a single folder, you can easily get a vector with all their names using list.files. If your folder contains other files, you can specify a regular expression pattern to limit it to just those you want to import:

```
#Here we print all the files we're going to read
list.files(pattern = "Plate1.*csv")

#> [1] "Plate1-0_00_00.csv" "Plate1-0_15_00.csv" "Plate1-0_30_00.csv"

#> [4] "Plate1-0_45_00.csv" "Plate1-1_00_00.csv" "Plate1-1_15_00.csv"

#> [7] "Plate1-1_30_00.csv" "Plate1-1_45_00.csv" "Plate1-10_0_00.csv"

#> [10] "Plate1-10_15_00.csv" "Plate1-10_30_00.csv" "Plate1-10_45_00.csv"

#> [13] "Plate1-11_00_00.csv" "Plate1-11_15_00.csv" "Plate1-11_30_00.csv"

#> [16] "Plate1-11_45_00.csv" "Plate1-12_00_00.csv" "Plate1-12_15_00.csv"

#> [19] "Plate1-12_30_00.csv" "Plate1-12_45_00.csv" "Plate1-13_00_00.csv"

#> [22] "Plate1-13_15_00.csv" "Plate1-13_30_00.csv" "Plate1-13_45_00.csv"

#> [25] "Plate1-14_45_00.csv" "Plate1-14_15_00.csv" "Plate1-14_30_00.csv"

#> [28] "Plate1-14_45_00.csv" "Plate1-15_00_00.csv" "Plate1-15_15_00.csv"

#> [31] "Plate1-15_30_00.csv" "Plate1-15_45_00.csv" "Plate1-16_45_00.csv"

#> [37] "Plate1-17_00_00.csv" "Plate1-17_15_00.csv" "Plate1-17_30_00.csv"
```

```
#> [40] "Plate1-17_45_00.csv" "Plate1-18_00_00.csv" "Plate1-18_15_00.csv"
#> [43] "Plate1-18_30_00.csv" "Plate1-18_45_00.csv" "Plate1-19_00_00.csv"
#> [46] "Plate1-19_15_00.csv" "Plate1-19_30_00.csv" "Plate1-19_45_00.csv"
#> [49] "Plate1-2_00_00.csv" "Plate1-2_15_00.csv" "Plate1-2_30_00.csv"
  [52] "Plate1-2 45 00.csv" "Plate1-20 00 00.csv" "Plate1-20 15 00.csv"
   [55]
       "Plate1-20_30_00.csv" "Plate1-20_45_00.csv" "Plate1-21_00_00.csv"
  [58] "Plate1-21_15_00.csv" "Plate1-21_30_00.csv" "Plate1-21_45_00.csv"
  [61] "Plate1-22 00 00.csv" "Plate1-22 15 00.csv" "Plate1-22 30 00.csv"
  [64] "Plate1-22_45_00.csv" "Plate1-23_00_00.csv" "Plate1-23_15_00.csv"
   [67] "Plate1-23_30_00.csv" "Plate1-23_45_00.csv" "Plate1-24_00_00.csv"
  [70] "Plate1-3_00_00.csv"
                              "Plate1-3_15_00.csv" "Plate1-3_30_00.csv"
  [73]
       "Plate1-3_45_00.csv"
                              "Plate1-4_00_00.csv"
                                                    "Plate1-4_15_00.csv"
   [76] "Plate1-4_30_00.csv"
                                                    "Plate1-5_00_00.csv"
                              "Plate1-4 45 00.csv"
   [79] "Plate1-5_15_00.csv"
                              "Plate1-5_30_00.csv"
                                                    "Plate1-5_45_00.csv"
  [82] "Plate1-6_00_00.csv"
                              "Plate1-6_15_00.csv"
                                                    "Plate1-6_30_00.csv"
  [85] "Plate1-6_45_00.csv"
                              "Plate1-7\_00\_00.csv"
                                                    "Plate1-7_15_00.csv"
   [88] "Plate1-7_30_00.csv"
                              "Plate1-7_45_00.csv"
                                                    "Plate1-8_00_00.csv"
  [91] "Plate1-8_15_00.csv"
                              "Plate1-8_30_00.csv"
                                                    "Plate1-8_45_00.csv"
#> [94] "Plate1-9_00_00.csv"
                              "Plate1-9_15_00.csv"
                                                    "Plate1-9_30_00.csv"
#> [97] "Plate1-9_45_00.csv"
#Here we save them to the temp_filenames variable
temp_filenames <- list.files(pattern = "Plate1.*csv")</pre>
```

Here's what one of the files looks like (where the values are absorbance/optical density):

```
print_df(read.csv(temp_filenames[1], header = FALSE, colClasses = "character"))
#>
                  0
#>
      Time
#>
#>
                                 4
                                         5
                                                  6
                                                                   8
                                                                             9
                                                                                    10
                                                                                             11
                                                                                                      12
#> A 6e-12
              4e-12 6e-12
                             6e-12
                                     4e-12
                                              6e-12
                                                      4e-12
                                                               4e-12
                                                                         4e-12
                                                                                 4e-12
                                                                                          4e-12
                                                                                                  4e-12
#> B 2e-12
             4e-12 6e-12
                             4e-12
                                     5e-11
                                              4e-12 2.8e-11
                                                               4e-12 1.26e-10
                                                                                 6e-12
                                                                                          2e-12
                                                                                                  6e-12
#> C 4e-12 3.4e-11 6e-12
                             4e-12
                                     4e-12
                                              2e-12
                                                      6e-12
                                                               4e-12
                                                                         4e-12
                                                                                 4e-12
                                                                                          6e-12
                                                                                                  6e-12
                                     4e-12
                                                                                 4e-12
#> D 4e-12
             2e-12 6e-12
                            6e-12
                                              4e-12
                                                      6e-12
                                                               4e-12
                                                                         6e-12
                                                                                          4e-12
                                                                                                  2e-12
#> E 4e-12
             4e-12 6e-12
                             6e-12
                                     4e-12
                                              4e-12
                                                      2e-12
                                                               4e-12
                                                                         6e-12
                                                                                 2e-12 6.2e-11
                                                                                                  6e-12
#> F 2e-12
             4e-12 4e-12
                             2e-12
                                     6e-12 1.4e-11
                                                      4e-12
                                                               4e-12
                                                                         6e-12 2.2e-11
                                                                                          2e-12
                                                                                                  4e-12
#> G 4e-12
              6e-12 4e-12
                             6e-12 7.8e-11
                                                               2e-12
                                                                         6e-12 7.2e-11
                                                                                          2e-12
                                                                                                  6e-12
                                              6e-12
                                                      2e-12
#> H 4e-12
             2e-12 4e-12 3.8e-11
                                     6e-12
                                              6e-12
                                                      2e-12 1.2e-10
                                                                         4e-12
                                                                                 2e-12
                                                                                          2e-12 3.8e-11
```

This file corresponds to all the reads for a single plate taken at the very first timepoint. We can see that the second row of the file contains some metadata about the timepoint when this plate read read was taken. Then, the data itself starts with column headers on row 4 and rownames in column 1.

If we want to read these files into R, we simply provide <code>import_blockmeasures</code> with the vector of file names, and save the result to some R object (here, <code>imported_blockdata</code>). Since our data doesn't start on the first row and column of the file, we simply need to specify what row/column it does start on using the <code>startrow</code>, <code>startcol</code>, <code>endrow</code>, and <code>endcol</code> arguments. (<code>import_blockmeasures</code> assumes that your data starts on the first row and column and ends on the last row and column, so you don't have to specify when your data meets those criteria).

```
#Now let's read it with import_blockmeasures
imported_blockdata <- import_blockmeasures(</pre>
```

```
files = temp_filenames, startrow = 4)
head(imported_blockdata, c(6, 8))
         block_name
                           A1
                                   A2
                                           A3
                                                     A4
                                                             A5
                                                                     A6
                                                                              A7
#> 1 Plate1-0_00_00
                        6e-12 4.0e-12
                                        6e-12 6.0e-12 4.0e-12 6.0e-12 4.0e-12
#> 2 Plate1-0 15 00 1.36e-10
                                2e-12 2.0e-12 4.00e-12
                                                          6e-12 4.0e-12
#> 3 Plate1-0_30_00
                        4e-12 4.0e-12
                                        2e-12
                                                  4e-12 2.0e-12
                                                                  6e-12
                                                                           6e-12
#> 4 Plate1-0 45 00
                        4e-12
                                4e-12 3.6e-11
                                                  4e-12 3.6e-11
                                                                  4e-12 4.0e-12
#> 5 Plate1-1 00 00
                        4e-12
                                6e-12 3.2e-11
                                               4.0e-12 4.0e-12
                                                                  4e-12
                                                                           4e-12
#> 6 Plate1-1 15 00
                        4e-12
                                4e-12
                                        6e-12
                                                  4e-12 4.0e-12 4.0e-12
                                                                           6e-12
```

Here we can see that import_blockmeasures has created a wide-shaped R object containing the data from all of our reads. It has also added the file names under the block_name column, so that we can easily track which row came from which file.

If you're looking at your data in Excel or a similar spreadsheet program, you'll notice that the columns aren't nicely numbered. Instead, they're coded by letter. Rather than have to count by hand what columns your data starts and ends on, just specify the column by letter and <code>import_blockmeasures</code> will translate that to a number for you! (in this example we don't have to specify a start column, since the data starts in the first column, but I do so just to show this letter-style functionality).

```
#We can specify rows or columns by Excel-style letters too
imported_blockdata <- import_blockmeasures(
  files = temp_filenames,
  startrow = 4, startcol = "A")</pre>
```

Specifying metadata

Sometimes, your input files will have information you want to import that's not included in the main block of data. For instance, with block-shaped data the timepoint is nearly always specified somewhere in the input file. import_blockmeasures can include that information as well via the metadata argument.

For example, let's return to our most-recent example files:

```
print df(read.csv(temp filenames[1], header = FALSE, colClasses = "character"))
#>
#>
      Time
#>
                  2
                                                   6
                                                                    8
#>
                         3
                                          5
                                                                              9
                                                                                     10
                                                                                              11
                                                                                                       12
         1
                                 4
#> A 6e-12
              4e-12 6e-12
                                               6e-12
                             6e-12
                                      4e-12
                                                       4e-12
                                                                4e-12
                                                                         4e-12
                                                                                  4e-12
                                                                                           4e-12
                                                                                                    4e-12
#> B 2e-12
              4e-12 6e-12
                             4e-12
                                      5e-11
                                              4e-12 2.8e-11
                                                                      1.26e-10
                                                                                           2e-12
                                                                                                    6e-12
                                                                4e-12
                                                                                  6e-12
#> C 4e-12 3.4e-11 6e-12
                             4e-12
                                      4e-12
                                              2e-12
                                                       6e-12
                                                                4e-12
                                                                         4e-12
                                                                                  4e-12
                                                                                           6e-12
                                                                                                    6e-12
#> D 4e-12
              2e-12 6e-12
                             6e-12
                                      4e-12
                                               4e-12
                                                       6e-12
                                                                4e-12
                                                                         6e-12
                                                                                  4e-12
                                                                                           4e-12
                                                                                                    2e-12
#> E 4e-12
              4e-12 6e-12
                             6e-12
                                      4e-12
                                              4e-12
                                                       2e-12
                                                                4e-12
                                                                          6e-12
                                                                                  2e-12 6.2e-11
                                                                                                    6e-12
#> F 2e-12
              4e-12 4e-12
                             2e-12
                                      6e-12 1.4e-11
                                                       4e-12
                                                                4e-12
                                                                          6e-12 2.2e-11
                                                                                           2e-12
                                                                                                    4e-12
#> G 4e-12
              6e-12 4e-12
                             6e-12 7.8e-11
                                               6e-12
                                                       2e-12
                                                                2e-12
                                                                          6e-12 7.2e-11
                                                                                           2e-12
                                                                                                    6e-12
#> H 4e-12
              2e-12 4e-12 3.8e-11
                                      6e-12
                                              6e-12
                                                       2e-12 1.2e-10
                                                                         4e-12
                                                                                  2e-12
                                                                                           2e-12 3.8e-11
```

In these files, the timepoint information was located in the 2nd row and 3rd column. Here's how we could specify that metadata in our import_blockmeasures command:

```
#Reading the blockcurves files with metadata included
imported_blockdata <- import_blockmeasures(</pre>
 files = temp filenames,
 startrow = 4,
 metadata = list("time" = c(2, 3)))
head(imported_blockdata, c(6, 8))
       block_name time
                                  A2
                                         A3
                                                        A5
#> 1 Plate1-0 00 00 0
                        6e-12 4.0e-12
                                     6e-12 6.0e-12 4.0e-12 6.0e-12
#> 2 Plate1-0_15_00 900 1.36e-10 2e-12 2.0e-12 4.00e-12 6e-12 4.0e-12
#> 3 Plate1-0_30_00 1800
                        4e-12 4.0e-12 2e-12 4e-12 2.0e-12 6e-12
4e-12 3.6e-11
#> 5 Plate1-1_00_00 3600
                               6e-12 3.2e-11 4.0e-12 4.0e-12
                        4e-12
                                                           4e-12
#> 6 Plate1-1_15_00 4500
                                            4e-12 4.0e-12 4.0e-12
                      4e-12
                               4e−12 6e−12
```

You can see that the metadata you specified has been added as a column in our output data.frame. When specifying metadata, the metadata argument must be a list of named vectors. Each vector should have two elements specifying the location of the metadata in the input files: the first element is the row, the second element is the column.

And just like how you can specify startrow, startcol, etc. with Excel-style lettering, the location of metadata can also be specified with Excel-style lettering.

```
#Reading the blockcurves files with metadata included
imported_blockdata <- import_blockmeasures(
    files = temp_filenames,
    startrow = 4,
    metadata = list("time" = c(2, "C")))</pre>
```

Reading multiple blocks from a single file

import_blockmeasures can also import multiple blocks from a single file, which some plate readers may output. In this case, you simply have to specify a vector of rows and columns that define the location of each block within the file.

First, let's create an example file. **Don't worry about how this code works**, normally this file would be created by the plate reader.

Let's take a look at what the file looks like:

```
#> block_name Plate1-0_00_00
#>
          time
                              0
                                      2
                                               3
                                                                  5
                                                                            6
#>
                              1
                                                          4
#>
                         6e-12
                                  4e-12
                                           6e-12
                                                     6e-12
                                                              4e-12
                                                                       6e-12
                                                                                4e-12
             Α
                                                                       4e-12 2.8e-11
#>
             B
                         2e-12
                                  4e-12
                                           6e-12
                                                     4e-12
                                                              5e-11
#>
             C
                         4e-12 3.4e-11
                                           6e-12
                                                     4e-12
                                                              4e-12
                                                                       2e-12
                                                                                6e-12
#>
             D
                         4e-12
                                  2e-12
                                           6e-12
                                                     6e-12
                                                              4e-12
                                                                       4e-12
                                                                                6e-12
#>
             E
                         4e-12
                                  4e-12
                                           6e-12
                                                     6e-12
                                                                       4e-12
                                                                                2e-12
                                                              4e-12
#>
             F
                         2e-12
                                  4e-12
                                           4e-12
                                                     2e-12
                                                              6e-12
                                                                     1.4e-11
                                                                                4e-12
             G
#>
                         4e-12
                                  6e-12
                                           4e-12
                                                     6e-12 7.8e-11
                                                                       6e-12
                                                                                2e-12
#>
             H
                         4e-12
                                  2e-12
                                           4e-12
                                                   3.8e-11
                                                              6e-12
                                                                       6e-12
                                                                                2e-12
#>
#> block_name Plate1-0_15_00
                            900
#>
          time
                                                                                    7
                                       2
                                                3
                                                                   5
#>
                              1
                                                                            6
#>
             Α
                      1.36e-10
                                  2e-12
                                           2e-12
                                                     4e-12
                                                              6e-12
                                                                       4e-12
                                                                                4e-12
#>
             В
                         4e-12
                                  1e-10
                                           4e-12 1.44e-10
                                                              6e-12
                                                                       2e-12
                                                                                4e-12
             C
#>
                         4e-12
                                  6e-12
                                           2e-12
                                                     4e-12
                                                              4e-12 3.6e-11
                                                                                2e-12
             D
#>
                                                     4e-12
                                                              2e-12
                                                                                6e-12
                         2e-12
                                  4e-12 1.6e-10
                                                                       4e-12
             E
#>
                                  4e-12
                                           2e-12
                                                  1.2e-11
                                                              2e-12
                                                                       2e-12
                                                                                4e-12
                         4e-12
```

We can see that the first block has some metadata above it, then the block of data itself. After that there's an empty row before the next block starts. In fact, if we look at the whole file, we'll notice that all the blocks go from column 1 ("A" in Excel) to column 13 ("M" in Excel), they start on rows 3, 15, 27, 39, etc, and end on rows 11, 23, 35, 47, etc. When we look in the file, we can also see that the very last block starts on row 1155 and ends on row 1163. Let's read this information in using import_blockmeasures (in this example we don't have to specify a start column, since the data starts in the first column, but I do to be explicit):

```
imported_blockdata <- import_blockmeasures(
   "blocks_single.csv",
   startrow = seq(from = 3, to = 1155, by = 12),
   endrow = seq(from = 11, to = 1163, by = 12),
   startcol = 1, endcol = 13)</pre>
```

Here we've used the built-in R function seq to generate the full vector of startrows and endrows. If we take a look, we can see that it's been read successfully:

```
head(imported_blockdata, c(6, 8))
                          A1
                                  A2
                                                                             A7
#>
        block_name
                                          A3
                                                    A4
                                                            A5
                                                                    A6
#> 1 blocks_single
                       6e-12 4.0e-12
                                       6e-12 6.0e-12 4.0e-12 6.0e-12 4.0e-12
#> 2 blocks_single 1.36e-10
                               2e-12 2.0e-12 4.00e-12
                                                         6e-12 4.0e-12
                                                                          4e-12
#> 3 blocks_single
                       4e-12 4.0e-12
                                       2e-12
                                                 4e-12 2.0e-12
                                                                  6e-12
                                                                          6e-12
                                                                  4e-12 4.0e-12
#> 4 blocks_single
                       4e-12
                               4e-12 3.6e-11
                                                 4e-12 3.6e-11
#> 5 blocks_single
                               6e-12 3.2e-11
                                              4.0e-12 4.0e-12
                       4e-12
                                                                  4e-12
                                                                          4e-12
#> 6 blocks_single
                       4e-12
                               4e-12
                                       6e-12
                                                 4e-12 4.0e-12 4.0e-12
                                                                          6e-12
```

Now let's add some metadata. Because we're reading from a single file, we need to specify the metadata slightly differently. Instead of the metadata being a single vector c(row,column) with the location, it's going to be a list of two vectors, one with the row numbers, and one with the column numbers.

Going back to the file, we can see that the time of the block is saved in the second column, in rows 2, 14, 26, 38, ... through 1154.

```
imported_blockdata <- import_blockmeasures(
   "blocks_single.csv",
   startrow = seq(from = 3, to = 1155, by = 12),
   endrow = seq(from = 11, to = 1163, by = 12),
   startcol = 1, endcol = 13,
   metadata = list("time" = list(seq(from = 2, to = 1154, by = 12), 2)))</pre>
```

And now if we take a look at the resulting object, we can see that the time metadata has been incorporated.

```
head(imported_blockdata, c(6, 8))
       block_name time
                            A1
                                    A2
                                           A3
                                                    A4
                                                           A5
#> 1 blocks single 0
                         6e-12 4.0e-12
                                        6e-12 6.0e-12 4.0e-12 6.0e-12
#> 2 blocks_single 900 1.36e-10 2e-12 2.0e-12 4.00e-12 6e-12 4.0e-12
#> 3 blocks_single 1800
                                        2e-12
                                               4e-12 2.0e-12
                         4e-12 4.0e-12
#> 4 blocks_single 2700
                         4e-12 4e-12 3.6e-11
                                                 4e-12 3.6e-11
                                                                4e-12
#> 5 blocks_single 3600
                         4e-12
                                6e-12 3.2e-11 4.0e-12 4.0e-12 4e-12
#> 6 blocks_single 4500
                         4e-12
                                 4e-12 6e-12 4e-12 4.0e-12 4.0e-12
```

Notes for more advanced use

Note that import_blockmeasures is essentially a wrapper function that calls read_blocks, uninterleave, and trans_block_to_wide. Any arguments for those functions can be passed to import_blockmeasures.

If you find yourself needing even more control over the process of importing block-shaped measures files, each of the functions is available for users to call themselves. So you can run the steps manually, first reading with read_blocks, separating plates as needed with uninterleave, then transforming to wide with trans_block_to_wide.

What to do next

Now that you've imported your block-shaped data, you'll need to transform it for later analyses. Jump directly to the **Transforming data** section.

Importing wide-shaped data

To import wide-shaped data, use the read_wides function. read_wides only requires a filename (or vector of filenames, or relative file paths) and will return a data.frame (or list of data.frames) that you can save in R.

A basic example

Here's a simple example. First, we need to create an example wide-shaped .csv file. **Don't worry how this code works**. When working with real growth curve data, these files would be output by the plate reader. All you need to do is know the file name(s) to put in you R code. In this example, the file name is widedata.csv.

```
#This code just creates a wide-shaped example file where the data doesn't
#start on the first row.
#Don't worry about how it works - when working with real growth
#curves data, this file would be created by the plate reader
```

Here's what the start of the file looks like (where the values are absorbance/optical density):

```
#Let's take a peek at what this file looks like
print_df(head(read.csv("widedata.csv", header = FALSE,
                        colClasses = "character"),
              c(10, 10))
#> Experiment name Experiment_1
#>
                     2023-01-21
        Start date
#>
#>
              Time
                                           C1
                                                 D1
                                                       E1
#>
                              A1
                                                             F1
#>
                 0
                           0.003 0.001 0.002 0.002 0.002 0.001 0.002 0.002 0.002
               900
                           0.068 0.002 0.002 0.001 0.002 0.002 0.001 0.002 0.001
#>
                           0.002\ 0.002\ 0.002\ 0.003\ 0.002\ 0.002\ 0.003\ 0.001\ 0.002
#>
              1800
              2700
                           0.002 0.003 0.003 0.044 0.135 0.002 0.003 0.012 0.002
#>
                           0.002 0.002 0.003 0.002 0.002 0.002 0.003 0.003 0.003
#>
              3600
```

This file contains all the reads for a single plate taken across all timepoints. We can see that the first two rows contain some metadata saved by the plate reader, like the name of the experiment and the date of the experiment. Then, we can see that the data starts on the 5th row with a header. The first column contains the timepoint information, and each subsequent column corresponds to a well in the plate.

If we want to read this file into R, we simply provide read_wides with the file name, and save the result to some R object (here, imported_widedata). Since our data doesn't start on the first row and column of the file, we simply need to specify what row/column it does start on using the startrow, startcol, endrow, and endcol arguments. (read_wides assumes that your data starts on the first row and column and ends on the last row and column, so you don't have to specify when you data meets those criteria. Also note that header = TRUE by default').

```
imported_widedata <- read_wides(files = "widedata.csv", startrow = 5)</pre>
```

The resulting data.frame looks like this:

```
head(imported_widedata, c(6, 10))

#> file Time A1 B1 C1 D1 E1 F1 G1 H1

#> 6 widedata 0 0.003 0.001 0.002 0.002 0.002 0.001 0.002 0.002

#> 7 widedata 900 0.068 0.002 0.002 0.001 0.002 0.001 0.002
```

```
#> 8 widedata 1800 0.002 0.002 0.002 0.003 0.002 0.002 0.003 0.001

#> 9 widedata 2700 0.002 0.003 0.003 0.044 0.135 0.002 0.003 0.012

#> 10 widedata 3600 0.002 0.002 0.003 0.002 0.002 0.003 0.003

#> 11 widedata 4500 0.002 0.003 0.002 0.043 0.017 0.001 0.002 0.003
```

Note that read_wides automatically saves the filename the data was imported from into the first column of the output data.frame. This is done to ensure that later on, data.frames from multiple plates can be combined without fear of losing the identity of each plate.

If you're looking at your data in Excel or a similar spreadsheet program, you'll notice that the columns aren't nicely numbered. Instead, they're coded by letter. Rather than have to count by hand what columns your data starts and ends on, just specify the column by letter and read_wides will translate that to a number for you! (in this example we don't have to specify a start column, since the data starts in the first column, but I do so just to show this letter-style functionality).

Note that if you have multiple files you'd like to read in, you can do so directly with a single read_wides command. In this case, read wides will return a list containing all the data frames:

```
#If we had multiple wide-shaped data files to import
imported_widedata <- read_wides(files = c("widedata.csv", "widedata2.csv"))</pre>
```

Specifying metadata

Sometimes, your input files will have information you want to import that's not included in the main block of data. For instance, many readers will output information like the experiment name and date into a header in the file. read_wides can include that information as well via the metadata argument.

The metadata argument should be a list of named vectors. Each vector should be of length 2, with the first entry specifying the row and the second entry specifying the column where the metadata is located.

For example, in our previous example files, the experiment name was located in the 2nd row, 2nd column, and the start date was located in the 3rd row, 2nd column. Here's how we could specify that metadata:

```
imported widedata <- read wides(files = "widedata.csv",
                               startrow = 5,
                               metadata = list("experiment_name" = c(1, 2),
                                                "start_date" = c(2, 2)))
head(imported_widedata, c(6, 8))
          file experiment_name start_date Time
                                                 A1
                                                       B1
#> 6 widedata
                 Experiment_1 2023-01-21
                                             0 0.003 0.001 0.002 0.002
#> 7 widedata
                 Experiment_1 2023-01-21 900 0.068 0.002 0.002 0.001
#> 8 widedata
                 Experiment_1 2023-01-21 1800 0.002 0.002 0.002 0.003
#> 9 widedata
                 Experiment_1 2023-01-21 2700 0.002 0.003 0.003 0.044
                 Experiment_1 2023-01-21 3600 0.002 0.002 0.003 0.002
#> 10 widedata
#> 11 widedata
                 Experiment_1 2023-01-21 4500 0.002 0.003 0.002 0.043
```

And just like how you can specify startrow, startcol, etc. with Excel-style lettering, the location of metadata can also be specified with Excel-style lettering.

Reading multiple wides from a single file

In the rare case that you have multiple wide-shaped datasets saved into a single file, read_wides can import that as well. Refer to the earlier section **Reading multiple blocks from a single file**, since the syntax for such operations is the same for read_wides as it is for import_blockmeasures.

What to do next

Now that you've imported your wide-shaped data, you'll need to transform it for later analyses. Continue on to the **Transforming data** section.

Importing tidy-shaped data

To import tidy-shaped data, you could use the built-in R functions like read.table. However, if you need a few more options, you can use the gcplyr function read_tidys. Unlike the built-in option, read_tidys can import multiple tidy-shaped files at once, can add the filename as a column in the resulting data.frame, and can handle files where the tidy-shaped information doesn't start on the first row and column.

read_tidys only requires a filename (or vector of filenames, or relative file paths) and will return a data.frame (or list of data.frames) that you can save in R.

If you've read in your tidy-shaped data, you won't need to transform it, so you can skip down to the [Including design elements] section.

Transforming data

Now that you've gotten your data into the R environment, we need to transform it before we can do analyses. To reiterate, this is necessary because most plate readers that generate growth curve data outputs it in block-shaped or wide-shaped files, but tidy-shaped data.frames are the best shape for analyses and required by gcplyr.

You can transform your data.frames using the trans * functions in gcplyr.

Transforming from wide-shaped to tidy-shaped

If the data you've read into the Renvironment is wide-shaped (or you've gotten wide-shaped data by transforming your originally block-shaped data), you'll transform it to tidy-shaped using trans_wide_to_tidy.

First, you need to provide trans_wide_to_tidy with theRobject created by read_wides or by trans_block_to_wide.

Then, you have to specify one of: * the columns your data (the spectrophotometric measures) are in via data_cols * what columns your non-data (e.g. time and other information) are in via id_cols

```
imported_blocks_now_tidy <- trans_wide_to_tidy(</pre>
 wides = imported_blockdata,
 id_cols = c("block_name", "time"))
imported_wides_now_tidy <- trans_wide_to_tidy(</pre>
 wides = imported_widedata,
 id_cols = c("file", "experiment_name", "start_date", "Time"))
print(head(imported_blocks_now_tidy), row.names = FALSE)
     block name time Well Measurements
6e-12
4e-12
6e-12
6e-12
#> blocks_single
              0 A5
                            4e-12
#> blocks_single
              0
                   A6
                            6e-12
```

What's next?

Now that you've imported and transformed your data to be tidy-shaped, you likely want to incorporate some design information on what went into each well (and plate). Alternatively, if you'd like to skip that step for now, you can go directly to pre-processing and plotting your data

- 1. Introduction
- 2. Importing & transforming data
- 3. Incorporating design information
- 4. Pre-processing and plotting your data
- 5. Processing your data
- 6. Analyzing your data
- 7. Statistics, merging other data, and other resources