Understanding the data

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Loading the data

It is assumed that working directory is *PearsonIOKI_DataScientist* frolder. The "data.csv" should be in working directory.

During loading the data empty strings are replaced with NA.

```
df = read.table("../data.csv", sep =",", head = TRUE, na.strings = "")
```

Getting look at the data

```
head(df)
##
     learner_id country in_course
                                       unit avg_score completion inv_rate
## 1
             39
                     PL
                                          1
                                                0.200
                                                            0.100
                                                                     0.000
                                 t
## 2
             39
                     PL
                                                1.000
                                 t
                                          3
                                                            0.087
                                                                     0.000
## 3
             39
                     PL
                                 t REVIEW 2
                                                0.100
                                                            0.273
                                                                     0.000
## 4
             41
                                                0.877
                     PL
                                 t
                                          1
                                                            0.350
                                                                     0.381
## 5
             41
                     PL
                                 t
                                          3
                                                0.000
                                                            0.087
                                                                     0.000
## 6
             41
                                          5
                     PL
                                                0.000
                                                            0.087
                                                                     1.000
str(df)
##
  'data.frame':
                    81432 obs. of 7 variables:
    $ learner_id: int 39 39 39 41 41 41 41 802 802 802 ...
    $ country : Factor w/ 86 levels "AD", "AF", "AG",...: 61 61 61 61 61 61 01 NA NA NA ...
    $ in_course : Factor w/ 2 levels "f","t": 2 2 2 2 2 2 2 2 2 2 ...
##
                : Factor w/ 17 levels "1", "10", "11", ...: 1 6 14 1 6 8 14 1 5 6 ...
   $ unit
  $ avg_score : num 0.2 1 0.1 0.877 0 0 0 0.954 0.877 0.883 ...
   $ completion: num 0.1 0.087 0.273 0.35 0.087 0.087 0.182 1 1 0.739 ...
    $ inv_rate : num  0 0 0 0.381 0 1 0 0 0 0 ...
summary(df)
```

```
##
      learner id
                          country
                                        in_course
                                                         unit
##
    Min.
                       TR
                               :52757
                                        f: 6100
                                                   1
                                                           :11435
    1st Qu.:1044868
                       ES
                               : 8409
                                        t:75332
                                                   2
                                                           : 9273
    Median :1092952
                       PL
                               : 5925
                                                   3
                                                           : 8163
##
                       CO
                                                   4
    Mean
           :1137210
                               : 5537
                                                           : 7136
                                                   5
    3rd Qu.:1244376
                       IT
                               : 1779
                                                           : 6448
## Max.
            :1390141
                       (Other): 7017
                                                   6
                                                           : 5916
##
                       NA's
                                                   (Other):33061
```

```
##
                         completion
                                            inv_rate
      avg_score
##
                              :0.0250
                                                 :0.00000
    Min.
            :0.0000
                      Min.
                                         Min.
##
    1st Qu.:0.7170
                      1st Qu.:0.7000
                                         1st Qu.:0.00000
    Median :0.8400
                                         Median :0.00000
##
                      Median :0.9620
##
    Mean
            :0.7921
                      Mean
                              :0.8098
                                         Mean
                                                 :0.04416
    3rd Qu.:0.9300
                      3rd Qu.:1.0000
                                         3rd Qu.:0.02300
##
            :1.0000
                              :1.0000
                                                 :1.00000
##
    Max.
                      Max.
                                         Max.
    NA's
##
            :2
```

Cleaning the data

The result of *summary* function shows that:

- 1. there are some missing data in *country* and *avg_score* variables
- 2. Variables avg_score, completion and inv_rate are between 0 and 1 so there is no outlier values or typos.

The values of factor variables can be listed to check if there is anything unexpected.

```
apply(df[, 2:4], 2, function(x) sort(table(x)))
```

```
## $country
##
   x
##
       BD
              PT
                     ZW
                             ΑT
                                    CA
                                           PM
                                                  CK
                                                          IR
                                                                 SV
                                                                        SZ
                                                                               AN
                                                                                       ΑO
                                                   3
##
                              2
                                     2
                                            2
                                                           3
                                                                  3
                                                                         3
                                                                                 4
                                                                                        4
        1
               1
                       1
##
       ΙQ
              PH
                     ΑI
                            DΖ
                                    ΗK
                                           LY
                                                  GM
                                                         ML
                                                                 CD
                                                                        CL
                                                                               VA
                                                                                      BL
##
        4
               4
                      5
                              5
                                     5
                                            5
                                                   6
                                                           6
                                                                  7
                                                                         8
                                                                                 9
                                                                                       10
##
       HR
              MA
                     VE
                             AG
                                    LV
                                           CR
                                                  TW
                                                          VN
                                                                 MD
                                                                        MK
                                                                               TC
                                                                                       AX
##
                     10
                                           12
                                                  12
                                                          12
                                                                        13
                                                                               13
                                                                                       14
       10
              10
                             11
                                    11
                                                                 13
##
       KW
              PS
                     TN
                            AL
                                    CY
                                           SK
                                                  SO
                                                          GR
                                                                 ID
                                                                        AF
                                                                               BR
                                                                                       AS
##
              16
                     16
                             17
                                    17
                                           17
                                                  18
                                                          23
                                                                 23
                                                                        24
                                                                               24
                                                                                       26
       14
                                                  BG
                                                          TM
                                                                 KR.
##
       YE
              EC
                     TH
                            AZ
                                    DE
                                           AQ
                                                                        LT
                                                                               JP
                                                                                      FR
       26
                             35
                                    37
                                                          48
                                                                 58
                                                                                       78
##
              29
                     29
                                           42
                                                  46
                                                                        68
                                                                               73
##
       AD
              AR
                     NZ
                            US
                                    GB
                                           SA
                                                  ВҮ
                                                          QU
                                                                 UA
                                                                        HU
                                                                               ΒE
                                                                                      RO
##
       83
              89
                     94
                             94
                                    96
                                          111
                                                 121
                                                         134
                                                                159
                                                                       167
                                                                              180
                                                                                     218
##
       CN
              TL
                     RU
                            AU
                                    CZ
                                           MX
                                                  CH
                                                         NL
                                                                 OM
                                                                        IT
                                                                               CO
                                                                                      PL
##
      233
             260
                    276
                           432
                                   464
                                          517
                                                 554
                                                        831
                                                                856
                                                                      1779
                                                                             5537
                                                                                    5925
##
       ES
              TR
##
    8409 52757
##
## $in_course
## x
##
               t
    6100 75332
##
##
## $unit
## x
                                                                                   REVIEW 3
##
          REVIEW 4
                                    12
                                                      11
                                                                        10
##
                 483
                                   938
                                                   1165
                                                                      1757
                                                                                        2385
## VIDEO PODCASTS
                                     9
                                               REVIEW 2
                                                                         8
##
               3367
                                 3610
                                                    3827
                                                                      4834
                                                                                        5300
```

##	REVIEW 1	6	5	4	3
##	5395	5916	6448	7136	8163
##	2	1			
##	9273	11435			

In the given set, there is no missing values or values that would look suspicious.

Dealing with missing data

Because there is only few missing cases, it is possible to print them:

learner_id	country	in_course	unit	avg_score	completion	inv_rate
802	NA	t	1	0.954	1	0
802	NA	t	2	0.877	1	0
802	NA	t	3	0.883	0.739	0
802	NA	t	REVIEW 1	0.904	1	0.141
802	NA	t	VIDEO	0.955	0.175	0
			PODCASTS			
5811	NA	\mathbf{t}	1	0.967	0.3	0
5811	NA	\mathbf{t}	2	0.611	0.154	0
5811	NA	t	8	0.557	0.45	0
1037376	TR	\mathbf{f}	10	NA	0.143	0
1187879	CO	f	1	NA	0.15	0

There are two learners with missing country Checking if it's possible to get this info from data:

```
## learner_id country
## 8 802 <NA>
## 15 5811 <NA>
```

Because there are only ten (of over 80K) cases with missing values, there is no point of replacing them and they can be ignored.

Prepering data to analyse

There is a script $clean_data.R$ that contains all data manipulation needed to be done, according to preaper raw data from data.csv to analyse. The cleaned data.frame is saved in file $clean_data.RData$

Some plots











