[Tutorial] SCN2A mutations in neurodevelopmental disorders

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1 1. Introduction

1.1 1.1. Background

SCN2A is a voltage-gated sodium channel gene that encodes the neuronal sodium channel NaV1.2 and plays a critical role in action potential initiation during early neurodevelopment. The latest study demonstrated that it is loss of function mutations that in SCN2A that lead to autism spectrum disorders (ASD), in contrast to gain of function, which leads to infantile seizures (Ben-Shalom 2018).

In this tutorial, we will handle genetic data for SCN2A mutations identified in latest genomic studies, and then explore the data format to describe genetic mutations using R basic functions. Our tutorial will utilize the summary data from Sanders et al. (2018).

1.2 1.2. Aims

What we will do with this dataset,

Understand the dataset from a scientific journal

Apply some functions you have learnt from the Chapter 2 and 3

2 2. Explore your data

2.1 2.1. Unboxing your dataset

Here we obtain the list of mutations in the Supplementary Table 1 from Sanders et al. (2018).

Using the rio package, reading the excel file from the file link into your workspace. If you don't have the rio package in your system, please install as following:

```
# install.packages('rio')
```

Now you can read the file from the website. This will create the d object.

```
d = rio::import('https://www.ncbi.nlm.nih.gov/pmc/articles/PMC6015533/bin/NIHMS957592-supplement-1.xlsx
```

Let's explore the object you just loaded. How would you check the class of the object d?

```
class(d)
```

```
## [1] "data.frame"
```

It shows that the d object is data.frame.

Then, let's overview the data frame. We will use head function to print out first few lines.

head(d)

```
##
        PatientID PatientSex PatientAgeAtAssessment Chr
                                                            Pos_hg19
## 1
                                                         2 154370122 166384278
                            Μ
                                                    7y
## 2
                            F
                                                         2 163706754 166506754
                                                    Зу
## 3
                            F
         Patient2
                                                         2 163875903 166478766
## 4 Case1,280269
                            F
                                                         2 165798270 166304847
                                                    4y
## 5
                            Μ
                                                    Зу
                                                           166019786 166249879
## 6
                            F
                                                   25<sub>y</sub>
                                                         2 166060054 166153823
##
                                      Effect c.DNA p.Protein
                    Alt Type
                                                               Inheritence
      12Mb Duplication
                        CNV DuplicationCNV
                                                             . DeNovoMosaic
        2.8Mb Deletion
## 2
                         CNV
                                 DeletionCNV
                                                                     DeNovo
## 3 2.6Mb Duplication
                         CNV DuplicationCNV
                                                                  Inherited
## 4 507kb Duplication
                         CNV DuplicationCNV
                                                                  Inherited
## 5
        230kb Deletion
                         CNV
                                 DeletionCNV
                                                                    Unknown
                         CNV
## 6
         94kb Deletion
                                 DeletionCNV
                                                                     DeNovo
##
                    Source SourcePMID Ben-Shalom2017 Wolff2017 AnyRecurrence
## 1
        Vecchi et al 2011
                             21893419
                                                     Y
## 2
                             20346423
                                                     Y
                                                                N
          Chen et al 2010
                                                                               1
## 3 Yoshitomi et al 2015
                             25843248
                                                     Y
                                                                N
                                                                               1
                             27153334
                                                     Y
                                                                N
## 4 Thuresson et al 2016
                                                                               1
                                                     Y
## 5
         Celle et al 2013
                             24080482
                                                                N
                                                                               1
       Bartnik et al 2011
                             20807223
                                                     Y
## 6
                                                                N
     UniqueSample/Family TrueRecurrence Seizures SeizureOnsetDays SeizureType
## 1
                        Y
                                        1
                                                  Y
                                                                   90
                                                                          Unknown
## 2
                        Y
                                                  N
                                                                              None
                                        1
                                                  Y
                        Y
                                                                    3
## 3
                                        1
                                                                          Unknown
```

```
## 4
                         Y
                                         1
                                                   Y
                                                                     3
                                                                           Unknown
## 5
                         γ
                                         1
                                                  N
                                                                               None
## 6
                         Y
                                         1
                                                  Y
                                                                   365
                                                                           Unknown
         ASD DD/ID DD/ID severity
                                                                          OtherFeatures
##
## 1
           N
                  Y
                               Mild
                                                                              clumsiness
## 2
           Y
                  Y
                             Severe
                                                      dysmorphia, immature myelination
## 3 Unknown
                  Y
                             Severe
                                                                       cerebral atrophy
## 4
           N
                  Ν
## 5
           Y
                  Y
                             Severe
                                                                           microcephaly
## 6
           N
                  v
                           Moderate hypotonia, bipolar disorder, behavioral problems
##
      Classification
## 1 IEE_Mild/Ataxia
## 2
               ASD/DD
## 3
                  IEE
## 4
                  BIS
## 5
               ASD/DD
## 6
               ASD/DD
```

When you execute code in a notebook chunk, an output will be visible immediately beneath the input. From this, you can see several rows and columns in the data frame.

Let's look at the first column PatientID' and check which class it is.

head(d\$PatientID)

```
## [1] "." "." "Patient2" "Case1,280269" "." ## [6] "."
```

Cool. Now you can see the TrueRecurrence column. What is the class of the column TrueRecurrence?

class(d\$TrueRecurrence)

[1] "numeric"

To check the class of columns, you don't need to type an individual column. We can overview the summary of the dataset using summary function. Which column has the character class?

summary(d)

```
##
     PatientID
                         PatientSex
                                             PatientAgeAtAssessment
                                                                           Chr
##
    Length: 293
                        Length:293
                                             Length:293
                                                                             :2
                                                                      Min.
##
    Class : character
                        Class : character
                                             Class : character
                                                                      1st Qu.:2
    Mode :character
##
                        Mode :character
                                             Mode : character
                                                                      Median:2
##
                                                                      Mean
                                                                             :2
##
                                                                      3rd Qu.:2
##
                                                                      Max.
                                                                             :2
##
      Pos_hg19
                             Ref
                                                 Alt
                                                                      Туре
                                             Length: 293
##
    Length: 293
                        Length: 293
                                                                 Length: 293
##
    Class : character
                        Class : character
                                             Class : character
                                                                  Class : character
    Mode :character
                        Mode :character
##
                                             Mode :character
                                                                 Mode : character
##
##
```

```
##
##
       Effect
                           c.DNA
                                                                 Inheritence
                                             p.Protein
                                             Length: 293
##
    Length:293
                        Length: 293
                                                                 Length: 293
    Class :character
                        Class : character
                                             Class : character
                                                                 Class : character
##
##
    Mode :character
                        Mode :character
                                             Mode : character
                                                                 Mode :character
##
##
##
##
       Source
                         SourcePMID
                                             Ben-Shalom2017
                                                                  Wolff2017
                        Length:293
##
    Length: 293
                                             Length: 293
                                                                 Length: 293
##
    Class : character
                        Class : character
                                             Class : character
                                                                 Class : character
                        Mode :character
                                             Mode :character
##
    Mode :character
                                                                 Mode : character
##
##
##
##
    AnyRecurrence
                      UniqueSample/Family TrueRecurrence
                                                               Seizures
##
    Min.
          : 1.000
                      Length: 293
                                           Min.
                                                   :1.000
                                                             Length:293
    1st Qu.: 1.000
                      Class : character
                                           1st Qu.:1.000
                                                             Class : character
   Median : 1.000
                      Mode : character
                                           Median :1.000
                                                             Mode :character
##
##
    Mean
          : 2.119
                                           Mean
                                                   :1.768
##
    3rd Qu.: 2.000
                                           3rd Qu.:1.000
    Max.
           :10.000
                                           Max.
                                                   :7.000
    SeizureOnsetDays
                                                 ASD
                                                                    DD/ID
##
                        SeizureType
    Length: 293
                        Length: 293
                                            Length: 293
                                                                 Length:293
##
##
    Class : character
                        Class : character
                                             Class : character
                                                                 Class : character
    Mode : character
                        Mode : character
                                             Mode : character
                                                                 Mode : character
##
##
##
    DD/ID severity
                        OtherFeatures
                                             Classification
##
##
    Length: 293
                        Length:293
                                             Length: 293
##
    Class : character
                        Class : character
                                             Class : character
##
    Mode :character
                        Mode : character
                                             Mode :character
##
##
##
```

2.2 2.2. Difference between data frame and matrix

Here we will convert the data frame into a matrix, and compare which part will be different in this. To convert a data frame into a matrix, you can use the command called as.matrix.

```
m = as.matrix(d)
```

Let's overview the matrix object. Can you tell difference with data frame?

```
head(m[,'TrueRecurrence'])
```

```
## 1 2 3 4 5 6
## "1" "1" "1" "1" "1" "1"
```

2.3 2.3. Subset and Sort

Some patients who have the SCN2A mutation (hereafter called "SCN2A patient") often have seizures. So we want to know when the seizure occurs in development.

Let's check the class first.

class(d\$SeizureOnsetDays)

```
## [1] "character"
```

Why this column contains character? Let's head the first few lines.

head(d\$SeizureOnsetDays)

```
## [1] "90" "." "3" "3" "." "365"
```

It seems that some rows contain samples who do not have seizure or unknown information. It's represented by ".", and also recorded in another column called Seizures.

head(d\$Seizures)

```
## [1] "Y" "N" "Y" "Y" "N" "Y"
```

So we want to subset rows where the seizure phenotype is available.

```
d1 = d[d$Seizures=='Y',]
```

Let's see how many samples have seizure phenotypes? Then, you can ask when is the earliest days for the representation of seizure phenotype? How can we check this? The fisrt, as seen previously the SeizureOnsetDays column is character so we cannot apply functions for numeric.

head(d1\$SeizureOnsetDays)

```
## [1] "90" "3" "365" "30" "1825"
```

So we have to convert this into numeric first.

```
d1$SeizureOnsetDays2 <- as.numeric(d1$SeizureOnsetDays)</pre>
```

Warning: NA

Hmm. There's an warning for NA introduction. This is because some rows do not have character that we can properly convert from character to numeric. So possible solutions are either you can bear with this in your downstream analyses or 2) convert character into an appropriate form of numeric conversion.

Then, the question is how can we find the rows with NA? We will ask whether the rows contains NA or not using is.na function. This will return boolean as to NA presence.

```
# I couldn't find any rows with NA head(is.na(d1$SeizureOnsetDays2))
```

[1] FALSE FALSE FALSE FALSE FALSE

```
# There are rows with NA in these
is.na(d1$SeizureOnsetDays2)
```

```
##
                                            [1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
##
                                  [13] TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE
                                 [25] FALSE F
                              [37] FALSE F
                                  [49] FALSE F
                             [61] FALSE FALSE
##
                              [73] FALSE FALSE TRUE FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE
                              [85] FALSE TRUE FALSE FA
                               [97] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE FALSE FALSE FALSE
## [109] FALSE FALSE
## [121] FALSE FALSE
## [133] FALSE FALSE
## [145] FALSE FALSE
## [157] FALSE FALSE FALSE TRUE FALSE FALSE FALSE FALSE FALSE FALSE
## [169] FALSE FALSE
## [181] FALSE FAL
## [193] FALSE FALSE FALSE FALSE
```

See we can find some rows with NA. One of them is the 13th row. Let's see how it looks like.

d1\$SeizureOnsetDays[13]

```
## [1] "<365"
```

Here you have < (angle bracket) in the character so it won't properly converted to numeric information. Did you find more of these cases?

```
d1[is.na(d1$SeizureOnsetDays2),]$SeizureOnsetDays
```

```
## [1] "<365" "<365" "<365" "<28" "<30" "<365" "<365" "<365" "<365" "<365" "<365"
```

Our NAs all contains <, which prevent converting a character into a numeric.

We would fix for downstream analyses. For example, we can convert <365 into 365. One function we can try is gsub. This replace your string into a format that you may not get NA. For example,

```
# gsub('pattern in your character', 'new character you want to replace', vectors for your character)
d1$SeizureOnsetDays3 <- gsub('<', '', d1$SeizureOnsetDays)
head(d1$SeizureOnsetDays3)</pre>
```

```
## [1] "90" "3" "365" "30" "1825"
```

Let's convert them into numerics.

```
d1$SeizureOnsetDays3 <- as.numeric(d1$SeizureOnsetDays3)</pre>
```

Did you get warning for this? Now we can ask our initial question. When is the earliest day for having seizure?

```
min(d1$SeizureOnsetDays3)
```

[1] 0

3 3. Exercise

The dataset contains more details for genetic mutations in SCN2A patients. From this information, what can we analyze further? Here I list up few questions you can examine further. - Finding the position of the genetic mutations within SCN2A. Which information you would use? If you are not familiar with positional information on genetic variants (or mutations), please find the Figure 1 or the slides for Mutation (BSMS205 Session 3-1). - Counting the recurrent mutations at the same protein position (in other words, the same mutations seen across different patients), and examine whether the patients have similar phenotype. - Finding the position where different consequences mutations occur. Please note that "consequences" are loss-of-function (Nonsense, Frameshift) or missense. - Sketch a plot to visualize your analysis.

Figure 1. Standard mutation nomenclature (Ogino et al. 2007). According to this guideline, genetic mutations can be represented for coding DNA reference sequences (c. prefix) and protein-level amino acid sequences (p. prefix).

3.1 3.1. For-loops and Vectorization

Here we examine more details of genetic mutations as to their functional consequence and position of SCN2A mutations. In the dataset includes, there are two columns called c.DNA and p.Protein, containing the cDNA or protein position for the genetic mutations. During these exercises, we will look at the concept of for-loop and vectorization, which you learn from the Chapter 3.4. Let's look at the column p.Protein. It contains protein positions from each patient. What would you check at the first place? - Task 1 - Task 2 - Task 3 - - Task N

Let's write down your code to explore this column.

head(d\$p.Protein)

```
## [1] "." "." "." "." "." "."
```

If you need more information on SCN2A, please visit the Uniprot description for SCN2A. The Uniprot database contains description for protein domains. Then, I would remove the characters from the string so we can have only numerics for positions. Here I use gsub function to extract numbers from string. Let's remove non-numeric characters from the string.

```
gsub('[^0-9]', '', 'p.R102X')
```

```
## [1] "102"
```

In the dataset, we have many rows for protein positions. One way we might try is to set up for-loop to process each row.

```
# for (i in 1:293) {
# a[i] <- gsub('[^0-9]', '', d[i, 'p.Protein'])
# }
```

Do you think this is an effective approach? As we have done in your assignment, for-loop is not a good choice to process vectors because R can do vectorization for this process with a shorter and clearer code. So this mean you can apply gsub on vector and return your output to another column (could be new assign).

```
help(gsub)
```

starting httpd help server ... done

library(tidyverse)

```
## -- Attaching packages -----
                                             ----- tidyverse 1.3.1 --
## v ggplot2 3.3.5
                   v purrr
                              0.3.4
## v tibble 3.1.4
                     v dplyr
                              1.0.7
## v tidyr
           1.1.3
                     v stringr 1.4.0
## v readr
           2.0.1
                   v forcats 0.5.1
## -- Conflicts -----
                                           ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
library(dplyr)
a <- d %>%
 mutate(d, protein_num = gsub('[^0-9]', '', p.Protein)) %>%
 select(p.Protein, protein_num)
```

```
##
            p.Protein protein_num
## 1
## 2
## 3
## 4
## 5
## 6
## 7
## 8
## 9
                p.D12N
                                 12
## 10
                p.R28C
                                 28
## 11
                                 36
                p.R36G
## 12
                p.R36G
                                 36
## 13
                                 36
                p.R36G
## 14
               p.V76fs
                                 76
## 15
                p.D82G
                                 82
              p.R102X
## 16
                                102
## 17
                                102
               p.R102X
## 18
           SpliceSite
## 19
           SpliceSite
## 20
               p.N132K
                                132
```

## 21	p.M136I	136
## 22	p.M136I	136
## 23	SpliceSite	
## 24	SpliceSite	
## 25	p.E169X	169
## 26	p.E169G	169
## 27	p.I172V	172
## 28	p.R188W	188
## 29	p.R188W	188
## 30	p.A202V	202
## 31	SpliceSite	
## 32	SpliceSite	
## 33	p.F207S	207
## 34	p.V208E	208
## 35	p.G211D	211
## 36	p.G211D	211
## 37	p.N212D	212
## 38	p.V213D	213
## 39	p.V213D	213
## 40	p.T218N	218
## 41	p.R220G	220
## 42	p.R223Q	223
## 43	p.T227I	227
## 44	SpliceSite	
## 45	p.T236S	236
## 46	p.I237N	237
## 47	p.I237N	237
## 48	p.A240S	240
## 49	p.M252V	252
## 50	p.C258S	258
## 51	p.V261M	261
## 52	p.V261M	261
## 53	p.A263T	263
## 54	p.A263V	263
## 55	p.A263V	263
## 56	p.A263V	263
## 57	p.A263V	263
## 58	p.A263V	263
## 59	p.A263V	263
## 60	p.A263V	263
## 61	p.A263V	263
## 62	p.G266X	266
## 63	p.W281X	281
## 64	p.F328V	328
## 65	p.F328V	328
## 66	p.D343G	343
## 67	p.T365M	365
## 68	p.R379H	379
## 69	p.R379H	379
## 70	p.L389F	389
## 70	p.V423L	423
## 71	p.V423L p.V423L	423
## 73	_	423 424
## 74	-	424
## 14	h. 54300	430

## 75	p.E430A	430
## 76	p.E430G	430
## 77	p.A439fs	439
## 78	p.A439fs	439
## 79	p.E440fs	440
## 80	p.G478fs	478
## 81	p.K502fs	502
## 82	p.G564V	564
## 83	p.S565fs	565
## 84	p.R583X	583
	p.R607X	607
## 86	p.D609fs	609
## 87	p.F612S	612
## 88	p.P614S	614
## 89	p.D649N	649
## 90	p.T674K	674
## 91	p.S686fs	686
## 92	p.S700X	700
## 93	SpliceSite	
## 94	p.E717Gfs	717
## 95	p.A733T	733
## 96	p.N772S	772
## 97	p.T784M	784
## 98		704
	SpliceSite	010
## 99	p.A812V	812
## 100	p.G828V	828
## 101	p.L849I	849
## 102	p.R850P	850
## 103	p.R853Q	853
## 104	p.R853Q	853
## 105	p.R853Q	853
## 106	p.R853Q	853
## 107	p.R853Q	853
## 108	p.R853Q	853
## 109	p.R853Q	853
## 110	p.R853Q	853
## 111	p.R853Q	853
## 112		
## 112	p.R853Q	853
	p.R856L	856
## 114	p.S863F	863
## 115	p.1873M	873
## 116	p.N876T	876
## 117	p.G879R	879
## 118	p.A880S	880
## 119	p.L881P	881
## 120	p.G882R	882
## 121	p.G882E	882
## 122	p.G882E	882
## 123	p.T885I	885
## 124	p.V887A	887
## 125	p.1891T	891
## 126	p.V892I	892
## 127	p.F895S	895
	p.6899S	899
## 128	p. 68995	899

##	129	p.G899S	899
##	130	p.K905N	905
##	131	p.K905N	905
##	132	p.K908E	908
##	133	p.F928C	928
##	134	p.F928C	928
##	135	p.H930Q	930
##	136	p.R937C	937
##	137	p.R937C	937
##	138	p.R937H	937
##	139	p.C959X	959
##	140	p.M965R	965
##	141	p.N976K	976
##	142	p.F978L	978
##	143	p.F978L	978
##	144	p.L983W	983
##	145	p.S987I	987
##	146	p.E999K	999
##	147	p.E999K	999
##	148	p.E999K	999
##	149	p.E999K	999
##	150	p.E999K	999
##	151	p.E999K	999
##	152	p.E999V	999
##	153	р. № 1999V р. № 1001K	1001
##	154	p.L1003I	1001
##	155	p.G1013X	1003
##	156		1013
		p.I1021fs	
##	157	p.I1021fs	1021
##	158	p.D1050V	1050
##	159	p.F1114L	1114
##	160	p.E1115K	1115
##	161	p.E1125fs	1125
##	162	p.M1128T	1128
##	163	p.E1155fs	1155
##	164	p.C1170Vfs	1170
##	165	p.E1211K	1211
##	166	p.E1211K	1211
##	167	p.E1211K	1211
##	168	p.G1223R	1223
##	169	p.R1235X	1235
##	170	p.K1260E	1260
##	171	p.K1260Q	1260
##	172	p.I1281F	1281
##	173	p.V1282F	1282
##	174	p.V1282F	1282
##	175	p.A1310S	1310
##	176	p.R1312T	1312
##	177	p.R1319W	1319
##	178	p.R1319Q	1319
##	179	p.R1319Q	1319
##	180	p.R1319Q	1319
##	181	p.R1319Q	1319
##	182	p.R1319Q	1319

## 183		
	p.R1319Q	1319
## 184	p.R1319P	1319
## 185	p.R1319L	1319
## 186	p.E1321K	1321
## 187	p.M1323V	1323
## 188	SpliceSite3-10	310
## 189	SpliceSite3-10	310
## 190	p.V1326L	1326
## 191	p.V1326D	1326
## 192	p.L1330F	1330
## 193	p.S1336Y	1336
## 194	p.S1336Y	1336
## 195	p.M1338T	1338
## 196	p.L1341R	1341
## 197	p.L1342P	1342
## 198	p.L1342P	1342
## 190	p.L1342P	1342
## 199	p.L1342P	1342
## 200		1342
	p.C1386R	
## 202	p.K1387Sfs	1387
## 203	p.W1398X	1398
## 204	p.V1408A	1408
## 205	SpliceSite3-10	310
## 206	p.T1420M	1420
## 207	p.K1422E	1422
## 208	p.R1435X	1435
## 209	p.R1435X	1435
## 210	p.R1435X	1435
## 211	${ t SpliceSite}$	
## 212	${ t SpliceSite}$	
## 213	p.I1473M	1473
## 214	p.Q1479P	1479
шш О1Г	- 01470D	4 4 0
## 215	p.Q1479P	1479
## 215 ## 216	p.Q1479P p.A1500T	1479 1500
## 216	p.A1500T	1500
## 216 ## 217	p.A1500T p.M1501fs	1500 1501
## 216 ## 217 ## 218	p.A1500T p.M1501fs p.R1515X	1500 1501
## 216 ## 217 ## 218 ## 219	p.A1500T p.M1501fs p.R1515X SpliceSite	1500 1501 1515
## 216 ## 217 ## 218 ## 219 ## 220	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A	1500 1501 1515 1521
## 216 ## 217 ## 218 ## 219 ## 220 ## 221	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A	1500 1501 1515 1521 1522
## 216 ## 217 ## 218 ## 219 ## 220 ## 221	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs	1500 1501 1515 1521 1522 1522 1528
## 216 ## 217 ## 218 ## 219 ## 220 ## 221 ## 222 ## 223 ## 224	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K	1500 1501 1515 1521 1522 1522 1528 1531
## 216 ## 217 ## 218 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K	1500 1501 1515 1521 1522 1522 1528 1531
## 216 ## 217 ## 218 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225 ## 226	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R	1500 1501 1515 1521 1522 1522 1528 1531 1531
## 216 ## 217 ## 218 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225 ## 226	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R p.S1536R	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537
## 216 ## 217 ## 218 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225 ## 227 ## 228	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537 1545
## 216 ## 217 ## 218 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225 ## 226 ## 227 ## 228	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1548V	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537 1545
## 216 ## 217 ## 219 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225 ## 226 ## 227 ## 228 ## 230	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1548V p.L1563V	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537 1545 1548
## 216 ## 217 ## 219 ## 220 ## 221 ## 223 ## 224 ## 225 ## 226 ## 227 ## 228 ## 230 ## 231	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1548V p.L1563V p.G1576R	1500 1501 1515 1521 1522 1522 1528 1531 1536 1537 1545 1548 1563 1576
## 216 ## 217 ## 218 ## 220 ## 221 ## 223 ## 224 ## 225 ## 226 ## 227 ## 228 ## 230 ## 231 ## 232	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1548V p.L1563V p.G1576R p.Y1589C	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537 1545 1548 1563 1576 1589
## 216 ## 217 ## 219 ## 220 ## 221 ## 223 ## 224 ## 225 ## 226 ## 227 ## 230 ## 231 ## 232 ## 233	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1545V p.M1548V p.L1563V p.G1576R p.Y1589C p.G1593R	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537 1545 1548 1563 1576 1589
## 216 ## 217 ## 218 ## 220 ## 221 ## 222 ## 223 ## 224 ## 225 ## 226 ## 227 ## 228 ## 230 ## 231 ## 232 ## 233 ## 234	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1548V p.L1563V p.G1576R p.Y1589C p.G1593R p.G1593R	1500 1501 1515 1521 1522 1522 1528 1531 1536 1537 1545 1548 1563 1576 1589 1593
## 216 ## 217 ## 219 ## 220 ## 221 ## 223 ## 224 ## 225 ## 226 ## 227 ## 230 ## 231 ## 232 ## 233	p.A1500T p.M1501fs p.R1515X SpliceSite p.Q1521X p.G1522A p.G1522A p.V1528Cfs p.Q1531K p.Q1531K p.S1536R p.I1537fs p.M1545V p.M1545V p.M1548V p.L1563V p.G1576R p.Y1589C p.G1593R	1500 1501 1515 1521 1522 1522 1528 1531 1531 1536 1537 1545 1548 1563 1576 1589

## 237	p.F1597L	1597
## 238	p.D1598G	1598
## 239	p.D1598V	1598
		1590
## 240	SpliceSite	1.000
## 241	p.P1622S	1622
## 242	p.T1623N	1623
## 243	p.R1626X	1626
## 244	p.R1626Q	1626
## 245	p.V1627M	1627
## 246	p.R1629H	1629
## 247	p.R1629H	1629
## 248	p.R1629L	1629
## 249	p.R1632fs	1632
## 250	p.G1634D	1634
## 251	p.G1634V	1634
## 252	p.R1635Q	1635
## 253	p.I1640S	1640
## 254	p.K1641N	1641
## 255	p.L1650P	1650
## 256	p.F1651C	1651
## 257	p.A1652P	1652
## 258	p.S1656F	1656
## 259	p.L1660W	1660
## 260	p.L1665F	1665
## 261	p.T1711Lfs	1711
## 262	p.W1716X	1716
## 263	p.C1731Y	1731
## 264	p.G1744R	1744
## 265	p.G1744E	1744
## 266	p.S1758R	1758
## 267	p.A1773T	1773
## 268	p.A1773V	1773
## 269	p.A1773V	1773
## 270	p.A1773V	1773
## 271	p.N1778I	1778
## 272	p.S1780I	1780
## 273	p.Q1811E	1811
## 274	p.L1829F	1829
## 275	p.H1853R	1853
## 276	p.L1875F	1875
## 277	p.E1880K	1880
## 278	p.R1882G	1882
## 279	p.R1882G	1882
## 280	p.R1882Q	1882
## 281	p.R1882Q	1882
## 282	p.R1882Q	1882
## 283	p.R1882Q	1882
## 284	p.R1882Q	1882
## 285	p.R1882Q	1882
## 286	p.R1882P	1882
## 287	p.R1882L	1882
## 288	p.R1902C	1902
## 289	p.R1902C	1902
## 290	p.Q1904E	1904
	F - 4-20	

```
## 291 p.R1918H 1918
## 292 p.K1933M 1933
## 293 p.S1974L 1974
```

3.2 3.2. Counting the recurrent mutations

Recurrent mutations are the ones that the same genetic mutations occur in multiple individuals. Recurrent mutations can be common 1) when the mutation does not affect on natural selection, 2) when the mutation is beneficial, 3) in the hotspot for a disease or strongly associated with trait. However, given we are dealing with the genetic mutations from rare disorders, the mutations in the dataset are supposed to be uniquely present in general population. Otherwise, the recurrent mutations can indicate strong association with the phenotype.

To assess the recurrent mutations, the first thing we can try is to examine whether the same mutations occur in multiple individuals. Since the dataset contains individual patients for each row, we can simply check the frequency using:

```
c <- as.data.frame(table(d$p.Protein))
c</pre>
```

##		Var1	Freq
##	1		8
##	2	p.A1310S	1
##	3	p.A1500T	1
##	4	p.A1652P	1
##	5	p.A1773T	1
##	6	p.A1773V	3
##	7	p.A202V	1
##	8	p.A240S	1
##	9	p.A263T	1
##	10	p.A263V	8
##	11	p.A439fs	2
##	12	p.A733T	1
##	13	p.A812V	1
##	14	p.A880S	1
##	15	p.C1170Vfs	1
##	16	p.C1386R	1
##	17	p.C1731Y	1
##	18	p.C258S	1
##	19	p.C959X	1
##	20	p.D1050V	1
##	21	p.D12N	1
##	22	p.D1598G	1
##	23	p.D1598V	1
##	24	p.D343G	1
##	25	p.D609fs	1
##	26	p.D649N	1
##	27	p.D82G	1
##	28	p.E1115K	1
##	29	p.E1125fs	1
##	30	p.E1155fs	1
##	31	p.E1211K	3
##	32	p.E1321K	1

```
## 33
               p.E169G
                           1
## 34
               p.E169X
                           1
## 35
              p.E1880K
                           1
               p.E430A
## 36
                           1
## 37
               p.E430G
                           1
## 38
               p.E430Q
                           1
## 39
              p.E440fs
                           1
             p.E717Gfs
## 40
                           1
## 41
               p.E999K
                           6
## 42
                           1
               p.E999V
## 43
              p.F1114L
                           1
## 44
              p.F1597L
                           1
## 45
              p.F1651C
                           1
               p.F207S
## 46
                           1
## 47
               p.F328V
                           2
## 48
               p.F612S
                           1
## 49
               p.F895S
                           1
## 50
                           2
               p.F928C
## 51
               p.F978L
                           2
              p.G1013X
## 52
                           1
## 53
              p.G1223R
                           1
## 54
              p.G1522A
                           2
## 55
              p.G1576R
                           1
## 56
              p.G1593R
                           2
## 57
                           1
              p.G1634D
## 58
              p.G1634V
                           1
## 59
              p.G1744E
                           1
## 60
              p.G1744R
                           1
                           2
## 61
               p.G211D
## 62
               p.G266X
                           1
## 63
              p.G478fs
                           1
## 64
               p.G564V
                           1
## 65
               p.G828V
                           1
## 66
               p.G879R
                           1
               p.G882E
                           2
## 67
## 68
               p.G882R
                           1
## 69
               p.G899S
                           2
## 70
              p.H1853R
                           1
## 71
               p.H930Q
                           1
                           2
## 72
             p.I1021fs
## 73
              p.I1281F
                           1
## 74
              p.I1473M
                           1
## 75
             p.I1537fs
                           1
## 76
              p.I1596S
                           1
## 77
              p.I1640S
                           1
## 78
               p.I172V
                           1
## 79
                           2
               p.I237N
## 80
               p.1873M
                           1
## 81
               p.I891T
                           1
## 82
              p.K1260E
                           1
## 83
              p.K1260Q
                           1
            p.K1387Sfs
## 84
## 85
              p.K1422E
                           1
## 86
              p.K1641N
```

```
## 87
             p.K1933M
                          1
## 88
             p.K502fs
                          1
                           2
## 89
              p.K905N
## 90
              p.K908E
                           1
## 91
             p.L1003I
                           1
## 92
             p.L1330F
                          1
## 93
             p.L1341R
                           1
## 94
             p.L1342P
                           4
## 95
             p.L1563V
                          1
## 96
              p.L1650P
                           1
## 97
             p.L1660W
                           1
## 98
             p.L1665F
                           1
## 99
             p.L1829F
                          1
## 100
             p.L1875F
## 101
              p.L389F
                           1
## 102
               p.L849I
                           1
## 103
              p.L881P
                          1
## 104
              p.L983W
                           1
## 105
             p.M1128T
                           1
## 106
             p.M1323V
                           1
## 107
             p.M1338T
                          1
## 108
              p.M136I
## 109
            p.M1501fs
                          1
## 110
             p.M1545V
                          1
## 111
             p.M1548V
                           1
## 112
              p.M252V
                           1
## 113
              p.M965R
                           1
## 114
             p.N1001K
                          1
## 115
              p.N132K
                           1
## 116
             p.N1778I
                          1
## 117
               p.N212D
                           1
## 118
              p.N772S
                          1
                           1
## 119
              p.N876T
## 120
              p.N976K
                           1
## 121
             p.P1622S
                          1
              p.P614S
## 122
                          1
## 123
             p.Q1479P
## 124
             p.Q1521X
                          1
                           2
## 125
             p.Q1531K
## 126
             p.Q1811E
                           1
## 127
             p.Q1904E
                           1
## 128
              p.R102X
                           2
## 129
             p.R1235X
                          1
## 130
             p.R1312T
                          1
## 131
             p.R1319L
                           1
## 132
             p.R1319P
                           1
## 133
                           6
             p.R1319Q
## 134
             p.R1319W
                           1
## 135
             p.R1435X
                           3
## 136
             p.R1515X
                          1
## 137
             p.R1626Q
                          1
## 138
             p.R1626X
## 139
             p.R1629H
                          2
## 140
             p.R1629L
```

```
## 141
            p.R1632fs
                          1
## 142
             p.R1635Q
                          1
## 143
                          2
             p.R1882G
## 144
             p.R1882L
                          1
## 145
             p.R1882P
                          1
## 146
             p.R1882Q
                          6
              p.R188W
## 147
                          2
             p.R1902C
                          2
## 148
## 149
             p.R1918H
                          1
## 150
              p.R220G
                          1
## 151
              p.R223Q
                          1
## 152
                p.R28C
                          1
                p.R36G
                          3
## 153
              p.R379H
## 154
## 155
              p.R583X
                          1
## 156
               p.R607X
                          1
## 157
               p.R850P
                          1
## 158
              p.R853Q
                          10
## 159
              p.R856L
                          1
                          2
## 160
              p.R937C
## 161
              p.R937H
                          1
## 162
             p.S1336Y
## 163
             p.S1536R
                          1
## 164
             p.S1656F
                          1
## 165
             p.S1758R
                          1
## 166
             p.S1780I
                          1
## 167
             p.S1974L
                          1
## 168
             p.S565fs
                          1
             p.S686fs
## 169
                          1
## 170
              p.S700X
                          1
              p.S863F
## 171
                          1
## 172
              p.S987I
                          1
## 173
             p.T1420M
                          1
## 174
             p.T1623N
                          1
## 175
           p.T1711Lfs
                          1
              p.T218N
## 176
                          1
## 177
              p.T227I
## 178
              p.T236S
                          1
## 179
              p.T365M
                          1
## 180
              p.T674K
                          1
              p.T784M
## 181
                          1
## 182
              p.T885I
                          1
## 183
             p.V1282F
                          2
## 184
             p.V1326D
                          1
## 185
             p.V1326L
                          1
## 186
             p.V1408A
                          1
## 187
           p.V1528Cfs
                          1
## 188
             p.V1627M
                          1
## 189
              p.V208E
                          1
## 190
               p.V213D
                          2
                          2
## 191
              p.V261M
              p.V423L
## 192
## 193
              p.V424L
                          1
## 194
              p.V76fs
```

```
## 195
              p.V887A
                          1
## 196
              p.V892I
                          1
## 197
             p.W1398X
## 198
             p.W1594R
                          1
## 199
             p.W1716X
                          1
## 200
              p.W281X
                          1
             p.Y1589C
## 201
                          1
## 202
           SpliceSite
                         13
## 203 SpliceSite3-10
                          3
```

or we can check the number of unique variants in the dataset by:

```
b <- d %>%
  group_by(Ref, Alt) %>%
  count()
```

```
## # A tibble: 41 x 3
               Ref, Alt [41]
## # Groups:
##
      Ref
               Alt
                                      n
##
      <chr>
                <chr>>
                                  <int>
##
   1 .
                                      1
   2 166153823 94kb Deletion
  3 166198692 26kb Duplication
   4 166249879 230kb Deletion
##
  5 166304847 507kb Duplication
  6 166384278 12Mb Duplication
  7 166478766 2.6Mb Duplication
                                      1
  8 166506754 2.8Mb Deletion
                                      1
## 9 166755313 671kb Duplication
                                      1
## 10 A
                ??
                                      1
## # ... with 31 more rows
```

How many unique variants you can find? and which variants are occurred in multiple times? Then, you can use other columns to check frequency for different groups. Which columns you would use for more grouping? If you find that, please check the recurrent mutations for each group.

```
data_1 <- d %>%
    group_by(PatientSex, Pos_hg19) %>%
    filter(PatientSex %in% c('M', 'F')) %>%
    count() %>%
    arrange(desc(n))
```

```
## # A tibble: 185 x 3
## # Groups:
               PatientSex, Pos_hg19 [185]
##
      PatientSex Pos_hg19
                               n
##
      <chr>
                 <chr>
                           <int>
##
  1 F
                 166198975
                               6
## 2 M
                 166229841
## 3 F
                 166231247
```

```
166166923
##
    5 M
                                  4
                  166210777
##
    6 M
                  166245961
                                  4
                                  3
    7 F
                  166245634
##
    8 F
                  166245961
                                  3
    9 M
##
                  166198975
                                  3
## 10 F
                                  2
                  166153563
## # ... with 175 more rows
```

3.3 3.3. What is the proportion of diagnosis for SCN2A patient?

SCN2A mutation can have multiple different consequences for disease phenotypes. It can cause ASD but also other neurodevelopmental conditions. In total cases, how many phenotypes occur in SCN2A patients. Then, calculate the proportion of the phenotypes among total cases.

```
d %>% group_by(Classification) %>% count() %>%
mutate(proportion = n / 293 *100)
```

```
## # A tibble: 7 x 3
## # Groups:
               Classification [7]
                          n proportion
     Classification
     <chr>>
                                  <dbl>
##
                      <int>
## 1 ASD/DD
                         92
                                  31.4
## 2 BIS
                         36
                                  12.3
## 3 IEE
                        111
                                  37.9
## 4 IEE_Mild/Ataxia
                          7
                                   2.39
## 5 Other
                          3
                                   1.02
                          5
## 6 Schizophrenia
                                   1.71
## 7 Unclear
                         39
                                  13.3
```

Then, you might be intrigued to whether females and males have different occurrence in each disorder. Let's check it.

```
d %>% filter(PatientSex %in% c("M", "F")) %>% group_by(PatientSex, Classification) %>% count() %>%
mutate(proportion = n / 293 *100)
```

```
## # A tibble: 13 x 4
## # Groups:
                PatientSex, Classification [13]
                                        n proportion
##
      PatientSex Classification
##
      <chr>>
                  <chr>>
                                    <int>
                                                <dbl>
##
    1 F
                  ASD/DD
                                       26
                                                8.87
    2 F
                  BIS
                                                3.75
##
                                       11
##
    3 F
                  IEE
                                       57
                                               19.5
##
    4 F
                  IEE_Mild/Ataxia
                                        3
                                                1.02
    5 F
                                        2
                                                0.683
##
                  Other
##
    6 F
                  Schizophrenia
                                        1
                                                0.341
##
    7 F
                                       14
                                                4.78
                  Unclear
    8 M
                  ASD/DD
                                       44
                                               15.0
    9 M
                  BIS
##
                                       12
                                                4.10
## 10 M
                  IEE
                                       43
                                               14.7
## 11 M
                  IEE_Mild/Ataxia
                                        4
                                                1.37
## 12 M
                  Other
                                        1
                                                0.341
                                                5.12
## 13 M
                  Unclear
                                       15
```

Another question you can ask is whether different mutation consequences occur in each phenotype. Let's find out how many mutation consequences are observed in each phenotype.

d %>% group_by(Classification, Effect) %>% count()

```
## # A tibble: 25 x 3
  # Groups:
               Classification, Effect [25]
##
      Classification Effect
                                                   n
                      <chr>
##
      <chr>
                                               <int>
    1 ASD/DD
                      DeletionCNV
##
                                                   3
##
   2 ASD/DD
                      DuplicationCNV
                                                   1
   3 ASD/DD
                      Frameshift
##
                                                  17
##
   4 ASD/DD
                      Missense
                                                  40
##
   5 ASD/DD
                      Nonsense
                                                  16
   6 ASD/DD
                      PopulationVariantInExAC
##
                                                   3
    7 ASD/DD
##
                      SpliceSite
                                                  12
    8 BIS
                      DuplicationCNV
##
                                                   1
##
  9 BIS
                      Frameshift
                                                   1
## 10 BIS
                      Missense
                                                  34
## # ... with 15 more rows
```

3.4 3.4. Find the position where different consequences of mutations occur

If you checked the recurrent mutations, you might want to find a locus where two or more variants occur. Such loci might indicate functionally important position of the gene and you might find some insight as to a cause of disease.

```
data <- d %>%
  group_by(Pos_hg19) %>%
  count() %>%
  arrange(desc(n)) %>%
  filter(n > 1)
```

```
## # A tibble: 44 x 2
  # Groups:
               Pos_hg19 [44]
      Pos_hg19
##
                     n
##
      <chr>
                 <int>
    1 166198975
##
                     9
    2 166166923
##
    3 166229841
                     8
##
    4 166245961
                     8
##
##
   5 166210777
                     6
   6 166231247
                     4
    7 166152439
                     3
##
##
    8 166223837
                     3
                     3
  9 166234155
## 10 166245202
                     3
## # ... with 34 more rows
```

3.5 3.5. Sketch a plot to visualize your analysis

When you examine the dataset, you would draw something to show your output. Though we haven't learnt how to plot data yet, we can have a quick sketch for the dataset. There's no restriction on your suggestion. Please submit your hand-drawing for the plot you would like to show from this dataset.

```
data_graph <- d %>%
  filter(PatientSex %in% c('F', 'M') & Inheritence == 'DeNovo') %>%
  group_by(Classification, PatientSex) %>%
  count()%>%
  group_by(PatientSex) %>%
  mutate(proportion = n / sum(n) * 100)
total <- d %>%
  filter(PatientSex %in% c('F', 'M') & Inheritence == 'DeNovo') %>%
  group_by(PatientSex) %>%
  count %>%
 mutate(total = sum(n))
total
## # A tibble: 2 x 3
## # Groups:
               PatientSex [2]
    PatientSex
                    n total
                <int> <int>
##
     <chr>>
## 1 F
                   92
                         92
## 2 M
                   92
                         92
data_graph
```

```
## # A tibble: 11 x 4
## # Groups:
               PatientSex [2]
##
      Classification PatientSex
                                      n proportion
##
      <chr>
                       <chr>
                                              <dbl>
                                  <int>
                       F
                                              27.2
##
   1 ASD/DD
                                     25
   2 ASD/DD
                                     38
                                              41.3
                       М
                       F
                                      7
   3 BIS
                                               7.61
##
                                      3
##
   4 BIS
                       М
                                               3.26
                       F
##
  5 IEE
                                     46
                                              50
##
   6 IEE
                       М
                                     37
                                              40.2
   7 IEE_Mild/Ataxia F
                                       2
                                               2.17
##
##
   8 IEE_Mild/Ataxia M
                                      3
                                               3.26
   9 Schizophrenia
                       F
                                      1
                                               1.09
## 10 Unclear
                       F
                                     11
                                              12.0
## 11 Unclear
                       М
                                     11
                                              12.0
```

the reason that I thought that proportion was something meaningful, is because as seen as the object total, number of Maleand Female patients with DeNovo mutation are equal (92)