

irCLIP-RNP dataset to compare 1U/ μ L vs 0.02U/ μ L RNase I digestions

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This is the pipeline used to analyze the irCLIP-RNP datasets after digestion with two different RNase doses (1U/ μ L and 0.02U/ μ L), named here as “high”: 1U/ μ L and “low”: 0.02U/ μ L. Gel sections ranging from 70 to 350KDa (a.k.a “whole RNP zone”) were subjected to MS. The experiment was performed in HEK293T cells.

1. Prepare the dataset

```
#Load the libraries
library(formatR)
library(DEP2)
library(tidyverse)
library(ggpubr)
library(Clipper)
library(viridis)
library(patchwork)
library(hrbrthemes)
library(igraph)
library(ggraph)
library(colormap)
library(UpSetR)
library(ggplot2)
library(arc4diagram)
library(pheatmap)
library(grid)
library(DESeq2)
library(data.table)
library(eulerr)
library(SuperExactTest)
```

In the first step, we prepared the dataset to create a SummarizedExperiment object starting from the proteinGroups.txt output file from MaxQuant.

```
# Open proteinGroups.txt results from MaxQuant
data <- read.delim("~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/0_Data/
proteinGroups.txt")

# Remove RPL proteins
data <- data[!grep("RPL", data$Gene.names), ]

# Generate unique names and ids
unique_pg <- make_unique(data, name = "Gene.names", ids = "Protein.IDs")
unique_pg <- unique_pg %>%
  arrange(name)

# Get the LFQ intensity
ecols <- grep("LFQ.intensity.", colnames(unique_pg))
```

```

# Keep isoform with higher LFQ intensity
iso <- grep("\\.\\d+$", unique_pg$name)
rbp <- gsub("\\.1", "", c(unique_pg$name[iso]))

# Find original row name of the isoform with higher
# intensity
find_max_value <- function(rbp) {
  filtered_df <- unique_pg[unique_pg$name %like% rbp, grep("LFQ.intensity.",
    colnames(unique_pg))]
  filtered_df$rowSums <- rowSums(filtered_df[, grep("LFQ.intensity.",
    colnames(filtered_df))])
  max_value <- which.max(filtered_df$rowSums)
  rownames <- rownames(filtered_df)[-max_value]
  return(rownames)
}
max_iso <- c(unlist(lapply(rbp, find_max_value)))

# Remove low intensity isoforms
unique_pg <- unique_pg[!(rownames(unique_pg) %in% max_iso), ]

head(unique_pg, n = 2)

```

```

##          Protein.IDs Majority.protein.IDs Peptide.counts..all.
## 1 Q8NE71;Q8NE71-2      Q8NE71;Q8NE71-2      23;22
## 2 Q9UG63;Q9UG63-2      Q9UG63;Q9UG63-2      3;3
## Peptide.counts..razor.unique. Peptide.counts..unique.
## 1          23;22          23;22
## 2          3;3          3;3
##          Protein.names Gene.names
## 1 ATP-binding cassette sub-family F member 1 ABCF1
## 2 ATP-binding cassette sub-family F member 2 ABCF2
##
##          Fasta.headers
## 1 sp|Q8NE71|ABCF1_HUMAN ATP-binding cassette sub-family F member 1 OS=Homo sapiens OX=9606 GN=
  ABCF1 PE=1 SV=2;sp|Q8NE71-2|ABCF1_HUMAN Isoform 2 of ATP-binding cassette sub-family F member
  1 OS=Homo sapiens OX=9606 GN=ABCF1
## 2 sp|Q9UG63|ABCF2_HUMAN ATP-binding cassette sub-family F member 2 OS=Homo sapiens OX=9606 GN=
  ABCF2 PE=1 SV=2;sp|Q9UG63-2|ABCF2_HUMAN Isoform 2 of ATP-binding cassette sub-family F member
  2 OS=Homo sapiens OX=9606 GN=ABCF2
## Number.of.proteins Peptides Razor...unique.peptides Unique.peptides
## 1          2          23          23          23
## 2          2          3          3          3
## Peptides.BZ10 Peptides.BZ11 Peptides.BZ12 Peptides.BZ13 Peptides.BZ14
## 1          14          21          16          16          16
## 2          1          2          1          1          1
## Peptides.BZ15 Peptides.BZ16 Peptides.BZ17 Peptides.BZ18 Peptides.BZ19
## 1          14          0          1          0          0
## 2          2          0          0          0          0
## Peptides.BZ20 Peptides.BZ21 Peptides.BZ6 Peptides.BZ7 Peptides.BZ8
## 1          0          0          14          0          0
## 2          0          0          0          0          0
## Peptides.BZ9 Razor...unique.peptides.BZ10 Razor...unique.peptides.BZ11
## 1          15          14          21
## 2          0          1          2
## Razor...unique.peptides.BZ12 Razor...unique.peptides.BZ13
## 1          16          16
## 2          1          1
## Razor...unique.peptides.BZ14 Razor...unique.peptides.BZ15
## 1          16          14
## 2          1          2
## Razor...unique.peptides.BZ16 Razor...unique.peptides.BZ17
## 1          0          1
## 2          0          0
## Razor...unique.peptides.BZ18 Razor...unique.peptides.BZ19
## 1          0          0

```

```

## 2 0 0
## Razor...unique.peptides.BZ20 Razor...unique.peptides.BZ21
## 1 0 0
## 2 0 0
## Razor...unique.peptides.BZ6 Razor...unique.peptides.BZ7
## 1 14 0
## 2 0 0
## Razor...unique.peptides.BZ8 Razor...unique.peptides.BZ9 Unique.peptides.BZ10
## 1 0 15 14
## 2 0 0 1
## Unique.peptides.BZ11 Unique.peptides.BZ12 Unique.peptides.BZ13
## 1 21 16 16
## 2 2 1 1
## Unique.peptides.BZ14 Unique.peptides.BZ15 Unique.peptides.BZ16
## 1 16 14 0
## 2 1 2 0
## Unique.peptides.BZ17 Unique.peptides.BZ18 Unique.peptides.BZ19
## 1 1 0 0
## 2 0 0 0
## Unique.peptides.BZ20 Unique.peptides.BZ21 Unique.peptides.BZ6
## 1 0 0 14
## 2 0 0 0
## Unique.peptides.BZ7 Unique.peptides.BZ8 Unique.peptides.BZ9
## 1 0 0 15
## 2 0 0 0
## Sequence.coverage.... Unique...razor.sequence.coverage....
## 1 31.2 31.2
## 2 6.6 6.6
## Unique.sequence.coverage.... Mol..weight..kDa. Sequence.length
## 1 31.2 95.925 845
## 2 6.6 71.289 623
## Sequence.lengths Q.value Score Sequence.coverage.BZ10....
## 1 845;807 0 173.4200 19.8
## 2 623;634 0 6.3927 2.4
## Sequence.coverage.BZ11.... Sequence.coverage.BZ12....
## 1 27.5 22.7
## 2 4.3 2.2
## Sequence.coverage.BZ13.... Sequence.coverage.BZ14....
## 1 24.1 22.6
## 2 2.4 2.4
## Sequence.coverage.BZ15.... Sequence.coverage.BZ16....
## 1 21.3 0
## 2 4.3 0
## Sequence.coverage.BZ17.... Sequence.coverage.BZ18....
## 1 1.8 0
## 2 0.0 0
## Sequence.coverage.BZ19.... Sequence.coverage.BZ20....
## 1 0 0
## 2 0 0
## Sequence.coverage.BZ21.... Sequence.coverage.BZ6....
## 1 0 22.4
## 2 0 0.0
## Sequence.coverage.BZ7.... Sequence.coverage.BZ8.... Sequence.coverage.BZ9....
## 1 0 0 20.9
## 2 0 0 0.0
## Intensity Intensity.BZ10 Intensity.BZ11 Intensity.BZ12 Intensity.BZ13
## 1 349190000 25728000 61873000 45660000 62547000
## 2 11625000 1719400 5244400 656040 1152500
## Intensity.BZ14 Intensity.BZ15 Intensity.BZ16 Intensity.BZ17 Intensity.BZ18
## 1 44739000 48837000 0 0 0
## 2 1543900 1308900 0 0 0
## Intensity.BZ19 Intensity.BZ20 Intensity.BZ21 Intensity.BZ6 Intensity.BZ7
## 1 0 0 0 28596000 0
## 2 0 0 0 0 0
## Intensity.BZ8 Intensity.BZ9 LFQ.intensity.BZ10 LFQ.intensity.BZ11
## 1 0 31209000 2859200 3946900
## 2 0 0 0 0
## LFQ.intensity.BZ12 LFQ.intensity.BZ13 LFQ.intensity.BZ14 LFQ.intensity.BZ15

```

```

## 1      3650600      2956000      2687800      3409300
## 2      0      0      0      0
## LFQ.intensity.BZ16 LFQ.intensity.BZ17 LFQ.intensity.BZ18 LFQ.intensity.BZ19
## 1      0      0      0      0
## 2      0      0      0      0
## LFQ.intensity.BZ20 LFQ.intensity.BZ21 LFQ.intensity.BZ6 LFQ.intensity.BZ7
## 1      0      0      4635600      0
## 2      0      0      0      0
## LFQ.intensity.BZ8 LFQ.intensity.BZ9 MS.MS.count.BZ10 MS.MS.count.BZ11
## 1      0      3041400      30      56
## 2      0      0      4      8
## MS.MS.count.BZ12 MS.MS.count.BZ13 MS.MS.count.BZ14 MS.MS.count.BZ15
## 1      35      38      32      36
## 2      1      3      2      4
## MS.MS.count.BZ16 MS.MS.count.BZ17 MS.MS.count.BZ18 MS.MS.count.BZ19
## 1      0      1      0      0
## 2      0      0      0      0
## MS.MS.count.BZ20 MS.MS.count.BZ21 MS.MS.count.BZ6 MS.MS.count.BZ7
## 1      0      0      27      0
## 2      0      0      0      0
## MS.MS.count.BZ8 MS.MS.count.BZ9 MS.MS.count
## 1      0      35      290
## 2      0      0      22
##

Peptide.sequences
## 1 AANAENDFSVQAEMSSR;AVSEEQQPALK;DVDDDGEEKELMER;EVLEALGEVMVSR;EVLEALGEVMVSRPR;
FAALDNEEEDKEEEIK;GAVTVVSHDAR;GFNLPLYQDAR;IGFFNQQYAEQLR;ILAGLGFDPEMQNRPTQK;
KAEQCSEEEEGEGEEEEEGGESK;KNQDEESQEAPELLK;KTFFEELAVEDK;LQGQLEQGDDTAAER;LSVPTSDEEDEVPAKPR;
LIPTHGEMR;MEETPTTEYLQR;NLDFGIDMSR;NQDEESQEAPELLK;QAMLENASDIK;RLQGQLEQGDDTAAER;STLLLLLTGK;
TFFEELAVEDK
## 2

EVPIPEHIDIYHLTR;FHWEQDQIAHMK;IPPPVIMVQNVSEK
## Only.identified.by.site Reverse Potential.contaminant id
## 1      351
## 2      431
##

Peptide.IDs
## 1 22;321;476;733;734;756;900;942;1281;1324;1453;1540;1574;1869;1915;1931;2002;2149;2194;2287;2450;2805;2910
## 2 736;816;1373
##

Peptide.is.razor
## 1 True;True;True;True;True;True;True;True;True;True;True;True;True;True;True;True;True;
True;True;True;True;True
## 2 True;True;True
##

Mod..peptide.IDs
## 1 26;344;508;780;781;806;958;1002;1361;1406;1407;1539;1631;1665;1975;2024;2040;2124;2125;2334;2335;2387;2485;24
## 2 783;870;1458
##

```

Evidence . IDs					
##	1	96;97;1598;1599;1600;1601;1602;1603;1604;1605;2327;2328;2329;2330;3919;3920;3921;3922;3923;3924;3925;3926;3927			
##	2				
##		3938;3939;3940;3941;3942;3943;4348;4349;4350;7842			
##					
MS.MS. IDs					
##	1	258;259;3256;3257;3258;3259;3260;3261;3262;3263;3264;3265;3266;3267;3268;3269;3270;3271;3272;3273;3274;3275;3276			
##	2				
##		7902;7903;7904;7905;7906;7907;7908;7909;7910;7911;7912;7913;7914;7915;7916;7917;8772;8773;8774;8775;8776;1673			
##					
Best .MS.MS					
##	1	259;3267;4698;7872;7889;8006;9978;10736;15218;16174;17567;18479;18902;23137;23804;23881;24510;28127;29072;303			
##	2	7915;8773;16733			
Oxidation . . M . . site . IDs	Oxidation . . M . . site . positions	Taxonomy . IDs	name	ID	
##	1	208;209;210;211	297;444;650;703	-1;-1 ABCF1	Q8NE71
##	2			-1;-1 ABCF2	Q9UG63

2. Create a SummarizedExperiment

We used the following design to create a SummarizedExperiment.

```
#Load design matrix
design <- read.delim("~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/0_Data/
  Design_matrix.txt")
design
```

```
##          label          condition      rbp replicate crosslinking
## 1  LFQ.intensity.BZ6  HNRNPA2B1_noUV HNRNPA2B1         1       noUV
## 2  LFQ.intensity.BZ7  HNRNPA2B1_high HNRNPA2B1         1       high
## 3  LFQ.intensity.BZ8  HNRNPA2B1_high HNRNPA2B1         2       high
## 4  LFQ.intensity.BZ9  HNRNPA2B1_low  HNRNPA2B1         1       low
## 5  LFQ.intensity.BZ10 HNRNPA2B1_low  HNRNPA2B1         2       low
## 6  LFQ.intensity.BZ11  HNRNPU_noUV   HNRNPU           1       noUV
## 7  LFQ.intensity.BZ12  HNRNPU_high  HNRNPU           1       high
## 8  LFQ.intensity.BZ13  HNRNPU_high  HNRNPU           2       high
## 9  LFQ.intensity.BZ14  HNRNPU_low   HNRNPU           1       low
## 10 LFQ.intensity.BZ15  HNRNPU_low   HNRNPU           2       low
## 11 LFQ.intensity.BZ16  HNRNPC_noUV  HNRNPC           1       noUV
## 12 LFQ.intensity.BZ17  HNRNPC_high  HNRNPC           1       high
## 13 LFQ.intensity.BZ18  HNRNPC_high  HNRNPC           2       high
## 14 LFQ.intensity.BZ19  HNRNPC_low   HNRNPC           1       low
## 15 LFQ.intensity.BZ20  HNRNPC_low   HNRNPC           2       low
```

```
#Create a SummarizedExperiment
se <- make_se(unique_pg, columns = ecol, expdesign = design)

#Subset the SummarizedExperiment according to the proteins
HNRNPC_se <- se[,se$rbp == "HNRNPC" ]
HNRNPU_se <- se[,se$rbp == "HNRNPU" ]
HNRNPA2B1_se <- se[,se$rbp == "HNRNPA2B1" ]

#Remove noUV samples for comparing the two RNase doses
HNRNPC_se_flt2 <- HNRNPC_se[,HNRNPC_se$crosslinking != "noUV" ]
HNRNPU_se_flt2 <- HNRNPU_se[,HNRNPU_se$crosslinking != "noUV" ]
HNRNPA2B1_se_flt2 <- HNRNPA2B1_se[,HNRNPA2B1_se$crosslinking != "noUV" ]
```

3. Perform enrichment analysis using DEP

Here, we performed enrichment analysis by comparing the RNase high vs RNase low using the DEP2 R package (PMID: 37624922).

```
set.seed(3)
#Function to calculate the differential expression
DEP_analysis <- function(se, a) {
  filt <- filter_se(se, thr = 0, filter_formula = ~ Reverse != '+' & Potential.contaminant != "+" &
    Peptides > 1 & Unique.peptides > 0)
  norm <- normalize_vsn(filt)
  imputed <- DEP2::impute(norm, fun = "QRILC")
  diff <- test_diff(imputed, type = "control", control = a, fdr.type = "BH")
  dep <- add_rejections(diff, alpha = 1, lfc = 0)
  results <- get_results(dep)
  return(list(se = se, filt = filt,
    norm = norm, imputed = imputed, diff = diff, dep = dep,
```

```

    results = results))
}

#Run DEP analysis
HNRNPC_se_DE <- DEP_analysis(se = HNRNPC_seflt2 ,a = "HNRNPC_low")
HNRNPU_se_DE <- DEP_analysis(se = HNRNPU_seflt2 ,a = "HNRNPU_low")
HNRNPA2B1_se_DE <- DEP_analysis(se = HNRNPA2B1_seflt2 ,a = "HNRNPA2B1_low")

head(HNRNPC_se_DE$results)

```

```

##      name      ID HNRNPC_high_vs_HNRNPC_low_p.val
## 1   DCD    P81605                      0.53394372
## 2  DDX1  Q92499-3                      0.06815325
## 3  DDX17 Q92841                      0.37545198
## 4  DDX3X O00571-2                      0.10961081
## 5   DDX5  P17844                      0.16397844
## 6  DHX9   Q08211                      0.18833307
##      HNRNPC_high_vs_HNRNPC_low_p.adj significant
## 1                      0.571             TRUE
## 2                      0.103             TRUE
## 3                      0.421             TRUE
## 4                      0.158             TRUE
## 5                      0.210             TRUE
## 6                      0.234             TRUE
##      HNRNPC_high_vs_HNRNPC_low_significant HNRNPC_high_vs_HNRNPC_low_ratio
## 1                      TRUE                      1.230
## 2                      TRUE                      -3.370
## 3                      TRUE                      0.220
## 4                      TRUE                      0.640
## 5                      TRUE                      0.608
## 6                      TRUE                      -0.512
##      HNRNPC_high_centered HNRNPC_low_centered
## 1                      0.617                 -0.617
## 2                     -1.690                  1.690
## 3                      0.110                 -0.110
## 4                      0.320                 -0.320
## 5                      0.304                 -0.304
## 6                     -0.256                  0.256

```

```

#Save the LFQ intensities
write.table(as.data.frame(HNRNPC_se_DE$dep@assays@data@listData), file = "~/Documents/Postdoc/PD_
  Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/2_DEP/HNRNPC_se_DE_LFQ_intensity.txt", row.names
  = TRUE, sep = "\t", quote = F)
write.table(as.data.frame(HNRNPU_se_DE$dep@assays@data@listData), file = "~/Documents/Postdoc/PD_
  Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/2_DEP/HNRNPU_se_DE_LFQ_intensity.txt", row.names
  = TRUE, sep = "\t", quote = F)
write.table(as.data.frame(HNRNPA2B1_se_DE$dep@assays@data@listData), file = "~/Documents/Postdoc/
  PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/2_DEP/HNRNPA2B1_se_DE_LFQ_intensity.txt", row.
  names = TRUE, sep = "\t", quote = F)

write.table(HNRNPC_se_DE$results, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_
  HighLow_293T/2_DEP/HNRNPC_se_norm_QRILC_res_LFQ_intensity.txt", row.names = FALSE, sep = "\t"
  , quote = F)
write.table(HNRNPU_se_DE$results, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_
  HighLow_293T/2_DEP/HNRNPU_se_norm_QRILC_res_LFQ_intensity.txt", row.names = FALSE, sep = "\t"
  , quote = F)
write.table(HNRNPA2B1_se_DE$results, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/
  RNase_HighLow_293T/2_DEP/HNRNPA2B1_se_norm_QRILC_res_LFQ_intensity.txt", row.names = FALSE,
  sep = "\t", quote = F)

```

Significant reduced proteins were selected as proteins having an FDR < 0.05 and a logFC vs RNase low (0.02U/ μ L) dose < 0.

4. Perform FDR analysis using Clipper

We used Clipper (PMID:34635147) function to compare noUV (1 replicate) and UVC samples (2 replicates for each RNase dose).

```
#Impute data with noUV
HNRNPC_se_flt <- HNRNPC_se[rownames(HNRNPC_se_DE$filt)]
write.table(as.data.frame(HNRNPC_se@assays@data@listData), file = "~/Documents/Postdoc/PD_
  Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/2_DEP/HNRNPC_se_LFQ_intensity_raw.txt", row.names
  = TRUE, sep = "\t", quote = F)
HNRNPC_se_flt <- DEP2::impute(HNRNPC_se_flt, fun = "QRILC")
HNRNPU_se_flt <- HNRNPU_se[rownames(HNRNPU_se_DE$filt)]
write.table(as.data.frame(HNRNPU_se@assays@data@listData), file = "~/Documents/Postdoc/PD_
  Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/2_DEP/HNRNPU_se_LFQ_intensity_raw.txt", row.names
  = TRUE, sep = "\t", quote = F)
HNRNPU_se_flt <- DEP2::impute(HNRNPU_se_flt, fun = "QRILC")
HNRNPA2B1_se_flt <- HNRNPA2B1_se[rownames(HNRNPA2B1_se_DE$filt)]
write.table(as.data.frame(HNRNPA2B1_se@assays@data@listData), file = "~/Documents/Postdoc/PD_
  Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/2_DEP/HNRNPA2B1_se_LFQ_intensity_raw.txt", row.
  names = TRUE, sep = "\t", quote = F)
HNRNPA2B1_se_flt <- DEP2::impute(HNRNPA2B1_se_flt, fun = "QRILC")

#Prepare data for clipper
HNRNPC_data <- as.data.frame(HNRNPC_se_flt@assays@data@listData)
HNRNPU_data <- as.data.frame(HNRNPU_se_flt@assays@data@listData)
HNRNPA2B1_data <- as.data.frame(HNRNPA2B1_se_flt@assays@data@listData)

#Run Clipper on low and high samples
HNRNPC_clipper_high = Clipper(score.exp = as.matrix(HNRNPC_data[,c(2,3)]), score.back = as.matrix(
  HNRNPC_data[,c(2,3,4,5)]), FDR = 0.1, analysis = "e")
HNRNPC_clipper_low = Clipper(score.exp = as.matrix(HNRNPC_data[,c(4,5)]), score.back = as.matrix(
  HNRNPC_data[,c(2,3,4,5)]), FDR = 0.1, analysis = "e")

HNRNPU_clipper_high = Clipper(score.exp = as.matrix(HNRNPU_data[,c(2,3)]), score.back = as.matrix(
  HNRNPU_data[,c(2,3,4,5)]), FDR = 0.1, analysis = "e")
HNRNPU_clipper_low = Clipper(score.exp = as.matrix(HNRNPU_data[,c(4,5)]), score.back = as.matrix(
  HNRNPU_data[,c(2,3,4,5)]), FDR = 0.1, analysis = "e")

HNRNPA2B1_clipper_high = Clipper(score.exp = as.matrix(HNRNPA2B1_data[,c(2,3)]), score.back = as.
  matrix(HNRNPA2B1_data[,c(2,3,4,5)]), FDR = 0.1, analysis = "e")
HNRNPA2B1_clipper_low = Clipper(score.exp = as.matrix(HNRNPA2B1_data[,c(4,5)]), score.back = as.
  matrix(HNRNPA2B1_data[,c(2,3,4,5)]), FDR = 0.1, analysis = "e")

#Attach results to data
HNRNPC_data$FDR_high <- HNRNPC_clipper_high$q
HNRNPU_data$FDR_high <- HNRNPU_clipper_high$q
HNRNPA2B1_data$FDR_high <- HNRNPA2B1_clipper_high$q

HNRNPC_data$FDR_low <- HNRNPC_clipper_low$q
HNRNPU_data$FDR_low <- HNRNPU_clipper_low$q
HNRNPA2B1_data$FDR_low <- HNRNPA2B1_clipper_low$q

#Calculate logFC
HNRNPC_data$logFC_high <- rowMeans(HNRNPC_data[,c(2,3)])-HNRNPC_data$HNRNPC_noUV_1
HNRNPC_data$logFC_low <- rowMeans(HNRNPC_data[,c(4,5)])-HNRNPC_data$HNRNPC_noUV_1

HNRNPU_data$logFC_high <- rowMeans(HNRNPU_data[,c(2,3)])-HNRNPU_data$HNRNPU_noUV_1
HNRNPU_data$logFC_low <- rowMeans(HNRNPU_data[,c(4,5)])-HNRNPU_data$HNRNPU_noUV_1

HNRNPA2B1_data$logFC_high <- rowMeans(HNRNPA2B1_data[,c(2,3)])-HNRNPA2B1_data$HNRNPA2B1_noUV_1
HNRNPA2B1_data$logFC_low <- rowMeans(HNRNPA2B1_data[,c(4,5)])-HNRNPA2B1_data$HNRNPA2B1_noUV_1
```



```
head(HNRNPC_data)
```

```
##      HNRNPC_noUV_1 HNRNPC_high_1 HNRNPC_high_2 HNRNPC_low_1 HNRNPC_low_2
## DCD      23.22081      23.00590      22.68121      24.15777      18.66839
## DDX1      20.53089      18.51677      17.78069      21.02425      21.10534
## DDX17     12.26102      23.08323      22.96714      22.99967      23.18721
## DDX3X     15.39217      19.04855      19.43683      19.86245      20.17217
## DDX5      13.12702      21.05768      20.41967      20.55309      20.28444
## DHX9      15.48094      21.39477      20.72251      21.82287      21.89360
##      FDR_high      FDR_low logFC_high logFC_low
## DCD  1.00000000  0.02222222 -0.3772564 -1.8077345
## DDX1  1.00000000  0.02222222 -2.3821578  0.5339063
## DDX17 0.02439024  0.02222222 10.7641615 10.8324139
## DDX3X 0.02439024  0.02222222  3.8505197  4.6251393
## DDX5  0.02439024  0.02222222  7.6116546  7.2917438
## DHX9  0.02439024  0.02222222  5.5777032  6.3772984
```

```
#Save the clipper results
write.table(HNRNPC_data, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_
293T/2_DEP/HNRNPC_clipper_results.txt", row.names = TRUE, sep = "\t", quote = F)
write.table(HNRNPU_data, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_
293T/2_DEP/HNRNPU_clipper_results.txt", row.names = TRUE, sep = "\t", quote = F)
write.table(HNRNPA2B1_data, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_
293T/2_DEP/HNRNPA2B1_clipper_results.txt", row.names = TRUE, sep = "\t", quote = F)
```

5. Visualization of the results

For the visualization, we first filter the DEP results for UVC-enriched proteins (a.k.a RDAPs). Only proteins with an FDR < 0.1 and a FC vs noUV > 3 in at least one RNase condition were categorized as RDAPs.

```
#Store DEP results
HNRNPC <- HNRNPC_se_DE$results
HNRNPU <- HNRNPU_se_DE$results
HNRNPA2B1 <- HNRNPA2B1_se_DE$results

#Get the significant UVC-enriched proteins
HNRNPC_data_sub <- subset(HNRNPC_data, (HNRNPC_data$logFC_low > log2(3) & HNRNPC_data$FDR_low <
0.1) | (HNRNPC_data$logFC_high > log2(3) & HNRNPC_data$FDR_high < 0.1))
HNRNPU_data_sub <- subset(HNRNPU_data, (HNRNPU_data$logFC_low > log2(3) & HNRNPU_data$FDR_low <
0.1) | (HNRNPU_data$logFC_high > log2(3) & HNRNPU_data$FDR_high < 0.1))
HNRNPA2B1_data_sub <- subset(HNRNPA2B1_data, (HNRNPA2B1_data$logFC_low > log2(3) & HNRNPA2B1_data
$FDR_low < 0.1) | (HNRNPA2B1_data$logFC_high > log2(3) & HNRNPA2B1_data$FDR_high < 0.1))

#Keep only UVC-enriched proteins
HNRNPC <- subset(HNRNPC, HNRNPC$name %in% rownames(HNRNPC_data_sub))
HNRNPU <- subset(HNRNPU, HNRNPU$name %in% rownames(HNRNPU_data_sub))
HNRNPA2B1 <- subset(HNRNPA2B1, HNRNPA2B1$name %in% rownames(HNRNPA2B1_data_sub))

#Determine the significant proteins
HNRNPC$sign <- HNRNPC$HNRNPC_high_vs_HNRNPC_low_p.adj < 0.05
HNRNPU$sign <- HNRNPU$HNRNPU_high_vs_HNRNPU_low_p.adj < 0.05
HNRNPA2B1$sign <- HNRNPA2B1$HNRNPA2B1_high_vs_HNRNPA2B1_low_p.adj < 0.05

head(HNRNPC, n = 2)
```

```
##      name      ID HNRNPC_high_vs_HNRNPC_low_p.val
## 3 DDX17      Q92841                      0.3754520
## 4 DDX3X      O00571-2                      0.1096108
##      HNRNPC_high_vs_HNRNPC_low_p.adj significant
## 3                      0.421      TRUE
## 4                      0.158      TRUE
##      HNRNPC_high_vs_HNRNPC_low_significant HNRNPC_high_vs_HNRNPC_low_ratio
## 3                      TRUE                      0.22
## 4                      TRUE                      0.64
##      HNRNPC_high_centered HNRNPC_low_centered sign
## 3                      0.11      -0.11 FALSE
## 4                      0.32      -0.32 FALSE
```

Rank plot of intensities

As a first visualization, we generated rank plots based on the imputed LFQ intensities for the RNase low samples and highlighted the top 20 UVC-enriched proteins with the highest intensity for all the tested RBPs. Black dots: RDAPs.

```
#Get the ranking of the proteins
HNRNPC_norm <- as.data.frame(HNRNPC_se_DE$dep@assays@data@listData)
HNRNPC_norm$name <- rownames(HNRNPC_norm)
HNRNPC_norm$low_avg <- rowMeans(HNRNPC_norm[,3:4])
HNRNPC_norm$UVC <- HNRNPC_norm$name %in% HNRNPC$name

HNRNPU_norm <- as.data.frame(HNRNPU_se_DE$dep@assays@data@listData)
HNRNPU_norm$name <- rownames(HNRNPU_norm)
HNRNPU_norm$low_avg <- rowMeans(HNRNPU_norm[,3:4])
HNRNPU_norm$UVC <- HNRNPU_norm$name %in% HNRNPU$name

HNRNPA2B1_norm <- as.data.frame(HNRNPA2B1_se_DE$dep@assays@data@listData)
HNRNPA2B1_norm$name <- rownames(HNRNPA2B1_norm)
HNRNPA2B1_norm$low_avg <- rowMeans(HNRNPA2B1_norm[,3:4])
HNRNPA2B1_norm$UVC <- HNRNPA2B1_norm$name %in% HNRNPA2B1$name

HNRNPC_norm$Rank = rank(-HNRNPC_norm$low_avg)
HNRNPU_norm$Rank = rank(-HNRNPU_norm$low_avg)
HNRNPA2B1_norm$Rank = rank(-HNRNPA2B1_norm$low_avg)

options(ggrepel.max.overlaps = Inf)

HNRNPC_plot <- ggplot(HNRNPC_norm, aes(x=Rank, y=low_avg, label = name)) +
  geom_point(aes(col = UVC)) +
  scale_color_manual(values = c('TRUE' = "black", 'FALSE' = "grey")) +
  ggrepel::geom_text_repel(data = subset(HNRNPC_norm, Rank < 20), size = 2) +
  theme_bw() +
  ggtitle("HNRNPC") +
  theme(legend.position = "none", panel.grid.major = element_blank(),
        panel.grid.minor = element_blank(),
        panel.background = element_blank(),
        axis.line = element_blank(),
        plot.title = element_text(hjust = 0.5)) +
  xlab("Rank") +
  ylab("log2(LFQ intensity)")

HNRNPU_plot <- ggplot(HNRNPU_norm, aes(x=Rank, y=low_avg, label = name)) +
  geom_point(aes(col = UVC)) +
  scale_color_manual(values = c('TRUE' = "black", 'FALSE' = "grey")) +
  ggrepel::geom_text_repel(data = subset(HNRNPU_norm, Rank < 20), size = 2) +
  theme_bw() +
  ggtitle("HNRNPU") +
  theme(legend.position = "none", panel.grid.major = element_blank(),
```



```

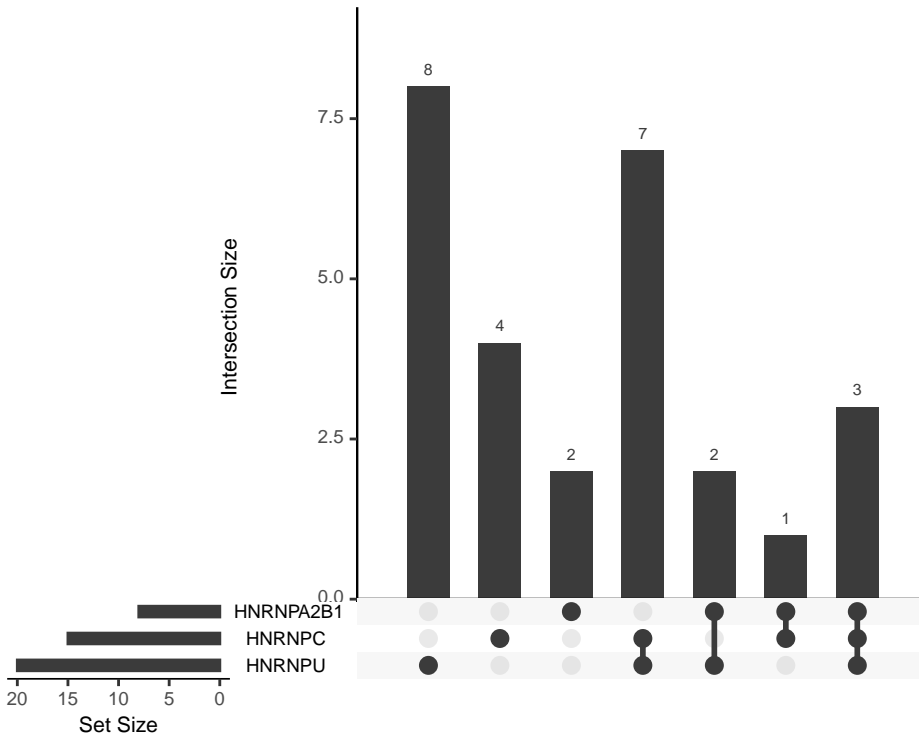
theme_bw() +
ggtitle("HNRNPC") +
theme(legend.position = "none", panel.grid.major = element_blank(),
      panel.grid.minor = element_blank(),
      panel.background = element_blank(),
      axis.line = element_blank(),
      plot.title = element_text(hjust = 0.5)) +
xlab("log2FC 1U/μL vs. 0.02U/μL RNase I") +
ylab("-log10(FDR)") +
xlim(-11, 11) +
ylim(0, 5)

HNRNPU.ggplot <- ggplot(data=HNRNPU, aes(x=HNRNPU_high_vs_HNRNPU_low_ratio, y=-log10(HNRNPU_high_
vs_HNRNPU_low_p.val))) + geom_vline(xintercept = 0, linetype = "dashed") +
geom_point(aes(col = sign)) +
scale_color_manual(values = c('TRUE' = "black", 'FALSE' = "grey")) +
ggrepel::geom_text_repel(data = filter(HNRNPU, sign), aes(label = name), size = 2, box.
padding = unit(0.1, "lines"), point.padding = unit(0.1, "lines"), segment.size = 0.5,max.
overlaps = Inf) +
theme_bw() +
ggtitle("HNRNPU") +
theme(legend.position = "none", panel.grid.major = element_blank(),
      panel.grid.minor = element_blank(),
      panel.background = element_blank(),
      axis.line = element_blank(),
      plot.title = element_text(hjust = 0.5)) +
xlab("log2FC 1U/μL vs. 0.02U/μL RNase I") +
ylab("-log10(FDR)") +
xlim(-11, 11) +
ylim(0, 5)

HNRNPA2B1.ggplot <- ggplot(data=HNRNPA2B1, aes(x=HNRNPA2B1_high_vs_HNRNPA2B1_low_ratio, y=-log10(
HNRNPA2B1_high_vs_HNRNPA2B1_low_p.val))) + geom_vline(xintercept = 0, linetype = "dashed") +
geom_point(aes(col = sign)) +
scale_color_manual(values = c('TRUE' = "black", 'FALSE' = "grey")) +
ggrepel::geom_text_repel(data = filter(HNRNPA2B1, sign), aes(label = name), size = 2, box.
padding = unit(0.1, "lines"), point.padding = unit(0.1, "lines"), segment.size = 0.5,max.
overlaps = Inf) +
theme_bw() +
ggtitle("HNRNPA2B1") +
theme(legend.position = "none", panel.grid.major = element_blank(),
      panel.grid.minor = element_blank(),
      panel.background = element_blank(),
      axis.line = element_blank(),
      plot.title = element_text(hjust = 0.5)) +
xlab("log2FC 1U/μL vs. 0.02U/μL RNase I") +
ylab("-log10(FDR)") +
xlim(-11, 11) +
ylim(0, 5)

ggarrange(HNRNPA2B1.ggplot, HNRNPC.ggplot, HNRNPU.ggplot, ncol = 3)

```

```
#Save the upsetplot as pdf
pdf("~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/3_DEP_visualization/
  Upsetplot_signprot.pdf", width = 3.5, height = 5)
upsetPlot
dev.off()
```

Arc diagram

We then used these information to generated a binary table of the interaction that we will use for generating the arc diagram.

```
#Function to create the binary table
fromList <- function (input) {
  elements <- unique(unlist(input))
  data <- unlist(lapply(input, function(x) {
    x <- as.vector(match(elements, x))
  }))
  data[is.na(data)] <- as.integer(0)
  data[data != 0] <- as.integer(1)
  data <- data.frame(matrix(data, ncol = length(input), byrow = F))
  data <- data[which(rowSums(data) != 0), ]
  names(data) <- names(input)
  row.names(data) <- elements
  return(data)
}

#Binary table with colnames:
sign.proteins <- fromList(lt.tsk)
write.table(sign.proteins, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_
  293T/3_DEP_visualization/Upsetplot_signprot.txt", row.names = TRUE, sep = "\t", quote = F)

head(sign.proteins)
```

##	HNRNPC	HNRNPU	HNRNPA2B1
## ELAVL1	1	1	1
## FUBP3	1	0	0
## HNRNPA0	1	0	0
## HNRNPA1	1	1	0
## HNRNPA2B1	1	1	0
## HNRNPA3	1	1	0

```

#Prepare data
data_int <- data.frame(to = c(HNRNPC_flt$name, HNRNPU_flt$name, HNRNPA2B1_flt$name),
                        ratio = c(HNRNPC_flt$HNRNPC_high_vs_HNRNPC_low_ratio, HNRNPU_flt$HNRNPU_
                        high_vs_HNRNPU_low_ratio, HNRNPA2B1_flt$HNRNPA2B1_high_vs_HNRNPA2B1_low_ratio))
data_int$from <- c(rep("HNRNPC", length(HNRNPC_flt$name)), rep("HNRNPU", length(HNRNPU_flt$name)),
                    rep("HNRNPA2B1", length(HNRNPA2B1_flt$name)))
connect <- data_int[,c(3,1:2)]
connect <- connect %>% group_by(from) %>% arrange(ratio, .by_group=TRUE)

mygraph <- graph_from_data_frame( connect, directed = FALSE )

#Number of connection per RBP
c( as.character(connect$from), as.character(connect$to)) %>%
  as.tibble() %>%
  group_by(value) %>%
  summarize(n=n()) -> coauth
colnames(coauth) <- c("name", "n")

#Add grouping
coauth2 <- coauth[order(coauth$n, decreasing = TRUE),]
coauth2$grp <- c( rep(1, 3), rep( 4 , length(coauth2$n[coauth2$n == 3])), rep( 3 , length(coauth2
  $n[coauth2$n == 2])), rep( 2 , length(coauth2$n[coauth2$n == 1])) )
coauth3 <- coauth2[order(coauth2$grp, decreasing = FALSE),]

#Generate a arcplot compatible object
star_edges = get.edgelist(mygraph)

#Load BioGRID interactions
biogrid <- read.delim("~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/0_Data/
  BIOGRID/RBP_biogrid_interactors.txt", sep="\t", header=TRUE)
biogrid <- data.frame("a" = biogrid$Official.Symbol.Interactor.A, "b" = biogrid$Official.Symbol.
  Interactor.B)

#Compare the significant proteins to BioGrid annotation
hnC <- biogrid == "HNRNPC"
hnC <- data.frame("a"=biogrid$a, "b"=biogrid$b, "c"=paste(hnC[,1], hnC[,2], sep="_"))
hnC.1 <- subset(hnC, c == "TRUE_FALSE")
hnC.2 <- subset(hnC, c == "FALSE_TRUE")
hnC <- rbind(hnC.1, hnC.2)
hnC.a <- HNRNPC_flt$name %in% hnC$a
hnC.b <- HNRNPC_flt$name %in% hnC$b
hnC.int <- data.frame("gene" = HNRNPC_flt$name, "biogrid" = paste(hnC.a, hnC.b, sep = "_"))
hnC.int$rbp <- "HNRNPC"

hna2b1 <- biogrid == "HNRNPA2B1"
hna2b1 <- data.frame("a"=biogrid$a, "b"=biogrid$b, "c"=paste(hna2b1[,1], hna2b1[,2], sep="_"))
hna2b1.1 <- subset(hna2b1, c == "TRUE_FALSE")
hna2b1.2 <- subset(hna2b1, c == "FALSE_TRUE")
hna2b1 <- rbind(hna2b1.1, hna2b1.2)
hna2b1.a <- HNRNPA2B1_flt$name %in% hna2b1$a
hna2b1.b <- HNRNPA2B1_flt$name %in% hna2b1$b
hna2b1.int <- data.frame("gene" = HNRNPA2B1_flt$name, "biogrid" = paste(hna2b1.a, hna2b1.b, sep =
  "_"))

```

```

hna2b1.int$rbp <- "HNRNPA2B1"

hnU <- biogrid == "HNRNPU"
hnU <- data.frame("a"=biogrid$a, "b"=biogrid$b, "c"=paste(hnU[,1], hnU[,2], sep="_"))
hnU.1 <- subset(hnU, c == "TRUE_FALSE")
hnU.2 <- subset(hnU, c == "FALSE_TRUE")
hnU <- rbind(hnU.1, hnU.2)
hnU.a <- HNRNPU_flt$name %in% hnU$a
hnU.b <- HNRNPU_flt$name %in% hnU$b
hnU.int <- data.frame("gene" = HNRNPU_flt$name, "biogrid" = paste(hnU.a, hnU.b, sep = "_"))
hnU.int$rbp <- "HNRNPU"

#Combine the BioGRID results and prepare data for arcplot
all <- rbind(hnC.int, hna2b1.int, hnU.int)
write.table(all, file = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/3_DEP
_visualization/RNaseHL_BioGRID_interactions.txt", sep = "\t", row.names = FALSE, quote = F)

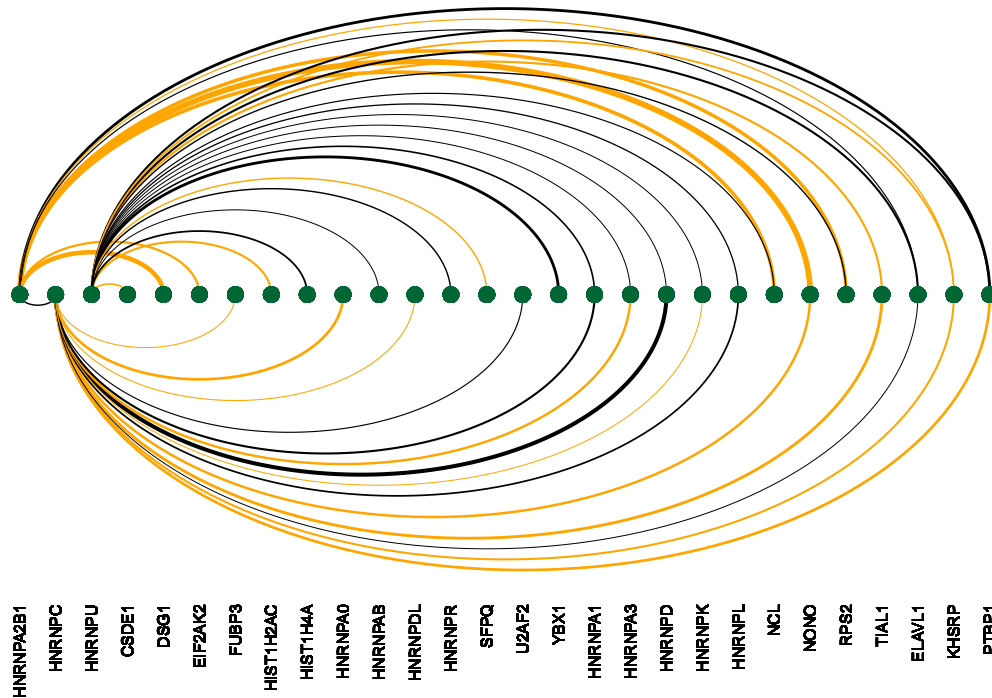
all$int <- paste(all$gene, all$rbp, sep = "_")
edges <- as.data.frame(star_edges)
edges$int <- paste(edges$V2, edges$V1, sep = "_")
all$int[grepl("HNRNPA2B1_HNRNPC", all$int)] <- "HNRNPC_HNRNPA2B1"

idx <- match(all$int, edges$int)

all <- all[match(edges$int, all$int),]
all$color <- ifelse(all$biogrid == "FALSE_FALSE", "orange", "black")

#Do the arcplot
arcplot(star_edges, show.nodes = TRUE, show.labels = TRUE, ordering=coauth3$name[c(3,2,1,4:length
(coauth3$name))],
        lwd.arcs=(connect$ratio*-1)/1.5, col.arcs=all$color,
        col.nodes = "#006633", cex.nodes=2, line=-0.5, col.labels = "black", ylim = c(-0.5,0.5),
        above = c(1:length(HNRNPA2B1_flt$name), (length(HNRNPA2B1_flt$name)+length(HNRNPC_flt$name)+1)
:length(star_edges[,1])))

```

Nodes: significant proteins; edges: significant reduced association with bait; edge width: logFC after DEP analysis; orange edge: novel putative associations.

```
#Save the arc plot as PDF
pdf("~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/3_DEP_visualization/
  Arcplot_signprot.pdf", width = 10, height = 5)
arcplot(star_edges, show.nodes = TRUE, show.labels = TRUE, ordering=coauth3$name[c(1,3,2,4:length
  (coauth3$name))]),
  lwd.arcs=(connect$ratio*-1)/1.5, col.arcs=all$color,
  col.nodes = "#006633", cex.nodes=2, line=-0.5,col.labels = "black", ylim = c(-0.5,0.5),
  above = c(1:length(HNRNPA2B1_flt$name), (length(HNRNPA2B1_flt$name)+length(HNRNPC_flt$name)+1)
  :length(star_edges[,1])))
dev.off()
```

Heatmap

We also generated heatmap of imputed LFQ intensities for the RDAPs significantly reduced in at least one RBP tested.

```
#Load results from imputed LFQ intensities used in DEP analysis
HNRNPC_LFQ <- as.data.frame(HNRNPC_se_DE$dep@assays@data@listData)
HNRNPU_LFQ <- as.data.frame(HNRNPU_se_DE$dep@assays@data@listData)
HNRNPA2B1_LFQ <- as.data.frame(HNRNPA2B1_se_DE$dep@assays@data@listData)

head(HNRNPC_LFQ)
```

```
##          HNRNPC_high_1 HNRNPC_high_2 HNRNPC_low_1 HNRNPC_low_2
```

## DCD	23.10995	22.86497	24.10267	19.40497
## DDX1	19.23464	15.86573	20.96915	20.87263
## DDX17	23.18728	23.15090	22.94457	22.95450
## DDX3X	19.15259	19.62059	18.60218	18.89130
## DDX5	21.16173	20.60343	20.49799	20.05173
## DHX9	21.49882	20.90627	21.76777	21.66089

```

#Get the significant proteins
sign_prot <- unique(c(HNRNPC_flt$name, HNRNPU_flt$name, HNRNPA2B1_flt$name))

rbp_fc <- merge(HNRNPC_flt[,c(1,7)], HNRNPU_flt[,c(1,7)], by = "name", all.x = TRUE, all.y = TRUE)
rbp_fc <- merge(rbp_fc, HNRNPA2B1_flt[,c(1,7)], by = "name", all.x = TRUE, all.y = TRUE)
rbp_fc <- rbp_fc %>% replace(is.na(.), 0)
rbp_fc$avglogfc <- rowMeans(rbp_fc[,2:4])

#Merge the LFQ intensities of RBP tested
all.LFQ <- merge(HNRNPA2B1_LFQ[,c(3,4,1,2)], HNRNPC_LFQ[,c(3,4,1,2)], by = "row.names", all = TRUE)
rownames(all.LFQ) <- all.LFQ$Row.names
all.LFQ <- merge(all.LFQ[-1], HNRNPU_LFQ[,c(3,4,1,2)], by = "row.names", all = TRUE)
rownames(all.LFQ) <- all.LFQ$Row.names
all.LFQ <- all.LFQ[-1]
all.LFQ <- all.LFQ[sign_prot,]

#Color scale to be used in the pheatmap
my.breaks <- c(seq(-1, -0.01, by=0.1), seq(0.1, 1, by=0.1))
my.colors <- c(colorRampPalette(colors = c("#2166AC", "#4393C3", "#92C5DE", "#D1E5F0", "#F7F7F7"))(length(my.breaks)/2), colorRampPalette(colors = c("#F7F7F7", "#FDDBC7", "#F4A582", "#D6604D", "#B2182B"))(length(my.breaks)/2))

#Annotation about significance
annotation <- as.data.frame(sign.proteins)
annotation$name <- rownames(annotation)
annotation <- merge(annotation, rbp_fc[,c(1,5)], by = "name")
rownames(annotation) <- annotation$name
annotation <- annotation[,c(3,2,4,5)]
annotation <- annotation %>% arrange(-HNRNPA2B1, -HNRNPC, -HNRNPU, avglogfc)
annotation[annotation == 1] <- "Yes"
annotation[annotation == 0] <- "No"
annotation$HNRNPU <- as.factor(annotation$HNRNPU)
annotation$HNRNPC <- as.factor(annotation$HNRNPC)
annotation$HNRNPA2B1 <- as.factor(annotation$HNRNPA2B1)
annotation <- annotation[, -c(4)]
colnames(annotation) <- c("HNRNPU_sign", "HNRNPC_sign", "HNRNPA2B1_sign")

ann_colors = list(HNRNPU_sign = c("Yes"="darkgreen", "No"="white"), HNRNPC_sign = c("Yes"="orange", "No"="white"), HNRNPA2B1_sign = c("Yes"="darkblue", "No"="white"))

all <- all.LFQ[match(rownames(annotation), rownames(all.LFQ)),]

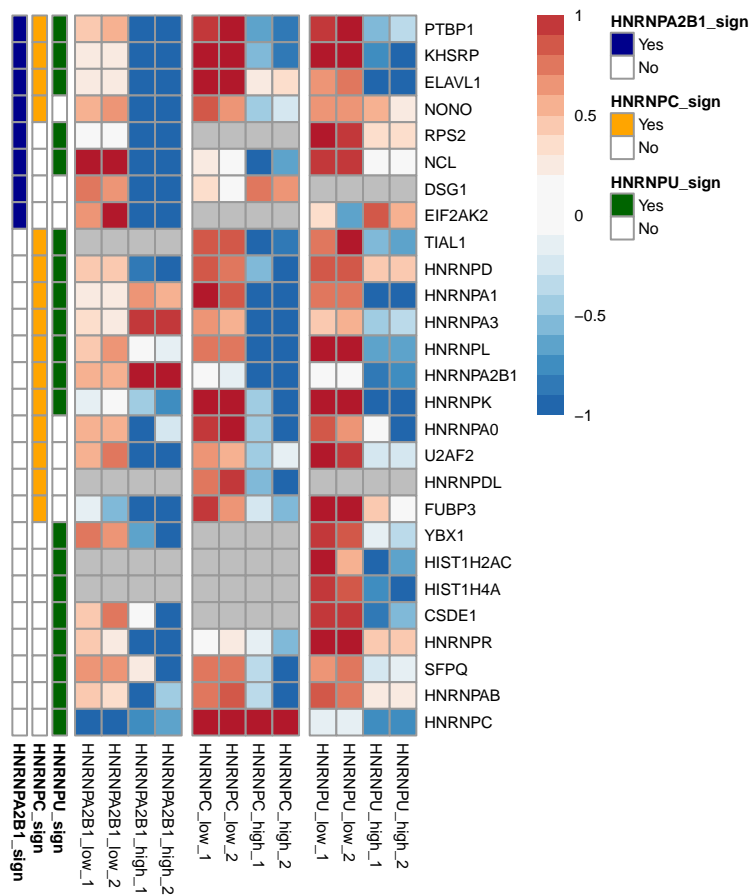
#Generate the heatmap
pheatmap <- pheatmap(
  mat = all,
  annotation_row = annotation,
  annotation_colors = ann_colors,
  cellheight=10,
  cellwidth = 10,
  na_col = "grey",
  color = my.colors,
  breaks = my.breaks,
  show_colnames = TRUE,
  show_rownames = TRUE,
  drop_levels = TRUE,
  fontsize = 5.5,
  cluster_rows = FALSE,

```

```

cluster_cols      = FALSE,
scale             = "row",
gaps_col = c(4,8)
)

```



```

#Save the heatmap
pheatmap <- pheatmap(
  mat          = all,
  annotation_row = annotation,
  annotation_colors = ann_colors,
  cellheight=5,
  cellwidth = 5,
)

```

```

na_col = "grey",
color = my.colors,
breaks = my.breaks,
show_colnames = TRUE,
show_rownames = TRUE,
drop_levels = TRUE,
fontsize = 5.5,
cluster_rows = FALSE,
cluster_cols = FALSE,
scale = "row",
gaps_col = c(4,8),
filename = "~/Documents/Postdoc/PD_Projects/3_irCLIP-RNP/MS/RNase_HighLow_293T/3_DEP_
visualization/all_heatmap_LFQ.pdf",
width = 5,
height = 5
)

```

All the visualizations were saved as pdf and modified in illustrator.

```
sessionInfo()
```

```

## R version 4.2.1 (2022-06-23)
## Platform: x86_64-apple-darwin17.0 (64-bit)
## Running under: macOS Big Sur ... 10.16
##
## Matrix products: default
## BLAS: /Library/Frameworks/R.framework/Versions/4.2/Resources/lib/libRblas.0.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.2/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
##
## attached base packages:
## [1] grid stats4 stats graphics grDevices utils datasets
## [8] methods base
##
## other attached packages:
## [1] SuperExactTest_1.1.0 eulerr_7.0.1
## [3] data.table_1.15.2 DESeq2_1.38.3
## [5] pheatmap_1.0.12 arc4diagram_0.1.12
## [7] UpSetR_1.4.0 colormap_0.1.4
## [9] ggraph_2.2.1 igraph_2.0.3
## [11] hrbrthemes_0.8.7 patchwork_1.2.0
## [13] viridis_0.6.5 viridisLite_0.4.2
## [15] Clipper_0.0.0.9000 ggpubr_0.6.0
## [17] lubridate_1.9.3 forcats_1.0.0
## [19] stringr_1.5.1 dplyr_1.1.4
## [21] purrr_1.0.2 readr_2.1.5
## [23] tidyr_1.3.1 tibble_3.2.1
## [25] ggplot2_3.5.0 tidyverse_2.0.0
## [27] DEP2_0.4.8.24 R6_2.5.1
## [29] limma_3.54.2 MSnbase_2.24.2
## [31] ProtGenerics_1.30.0 mzR_2.32.0
## [33] Rcpp_1.0.12 MsCoreUtils_1.10.0
## [35] SummarizedExperiment_1.28.0 Biobase_2.58.0
## [37] GenomicRanges_1.50.2 GenomeInfoDb_1.34.9
## [39] IRanges_2.32.0 S4Vectors_0.36.2
## [41] BiocGenerics_0.44.0 MatrixGenerics_1.10.0
## [43] matrixStats_1.2.0 formatR_1.14
##
## loaded via a namespace (and not attached):
## [1] missForest_1.5 bit64_4.0.5
## [3] knitr_1.45 DelayedArray_0.24.0

```

##	[5]	KEGGREST_1.38.0	RCurl_1.98-1.14
##	[7]	AnnotationFilter_1.22.0	doParallel_1.0.17
##	[9]	generics_0.1.3	preprocessCore_1.60.2
##	[11]	cowplot_1.1.3	RSQlite_2.3.5
##	[13]	proxy_0.4-27	bit_4.0.5
##	[15]	tzdb_0.4.0	httpuv_1.6.14
##	[17]	assertthat_0.2.1	TCseq_1.22.6
##	[19]	xfun_0.42	hms_1.1.3
##	[21]	evaluate_0.23	promises_1.2.1
##	[23]	fansi_1.0.6	DBI_1.2.2
##	[25]	geneplotter_1.76.0	ellipsis_0.3.2
##	[27]	RSpectra_0.16-1	QFeatures_1.8.0
##	[29]	backports_1.4.1	fontLiberation_0.1.0
##	[31]	V8_4.4.2	annotate_1.76.0
##	[33]	fontBitstreamVera_0.1.1	vctrs_0.6.5
##	[35]	imputeLCMD_2.1	abind_1.4-5
##	[37]	cachem_1.0.8	withr_3.0.0
##	[39]	ggforce_0.4.2	itertools_0.1-3
##	[41]	GenomicAlignments_1.34.1	fdrtool_1.2.17
##	[43]	MultiAssayExperiment_1.24.0	cluster_2.1.6
##	[45]	lazyeval_0.2.2	crayon_1.5.2
##	[47]	crul_1.4.0	labeling_0.4.3
##	[49]	glmnet_4.1-8	edgeR_3.40.2
##	[51]	pkgconfig_2.0.3	tweenr_2.0.3
##	[53]	rlang_1.1.3	lifecycle_1.0.4
##	[55]	sandwich_3.1-0	downloader_0.4
##	[57]	fontquiver_0.2.1	httpcode_0.3.0
##	[59]	affyio_1.68.0	extrafontdb_1.0
##	[61]	randomForest_4.7-1.1	polyclip_1.10-6
##	[63]	rngtools_1.5.2	Matrix_1.6-5
##	[65]	carData_3.0-5	zoo_1.8-12
##	[67]	GlobalOptions_0.1.2	png_0.1-8
##	[69]	rjson_0.2.21	bitops_1.0-7
##	[71]	Biostrings_2.66.0	blob_1.2.4
##	[73]	doRNG_1.8.6	shape_1.4.6.1
##	[75]	rstatix_0.7.2	tmvtnorm_1.6
##	[77]	ggsignif_0.6.4	scales_1.3.0
##	[79]	memoise_2.0.1	magrittr_2.0.3
##	[81]	plyr_1.8.9	zlibbioc_1.44.0
##	[83]	compiler_4.2.1	RColorBrewer_1.1-3
##	[85]	pcaMethods_1.90.0	clue_0.3-65
##	[87]	Rsamtools_2.14.0	cli_3.6.2
##	[89]	affy_1.76.0	XVector_0.38.0
##	[91]	MASS_7.3-60.0.1	tidyselect_1.2.1
##	[93]	vsn_3.66.0	stringi_1.8.3
##	[95]	highr_0.10	yaml_2.3.8
##	[97]	norm_1.0-11.1	askpass_1.2.0
##	[99]	locfit_1.5-9.9	MALDIquant_1.22.2
##	[101]	ggrepel_0.9.5	tools_4.2.1
##	[103]	timechange_0.3.0	parallel_4.2.1
##	[105]	circlize_0.4.16	rstudioapi_0.15.0
##	[107]	foreach_1.5.2	gridExtra_2.3
##	[109]	farver_2.1.1	mzID_1.36.0
##	[111]	Rtsne_0.17	digest_0.6.35
##	[113]	BiocManager_1.30.22	shiny_1.8.0
##	[115]	gfonts_0.2.0	car_3.1-2
##	[117]	broom_1.0.5	later_1.3.2
##	[119]	ncdf4_1.22	httr_1.4.7
##	[121]	gdtools_0.3.5	AnnotationDbi_1.60.2
##	[123]	ComplexHeatmap_2.14.0	colorspace_2.1-0
##	[125]	XML_3.99-0.16.1	reticulate_1.35.0
##	[127]	umap_0.2.10.0	splines_4.2.1
##	[129]	graphlayouts_1.1.1	gmm_1.8
##	[131]	systemfonts_1.0.5	xtable_1.8-4
##	[133]	jsonlite_1.8.8	tidygraph_1.3.1
##	[135]	pillar_1.9.0	htmltools_0.5.7
##	[137]	mime_0.12	glue_1.7.0
##	[139]	fastmap_1.1.1	BiocParallel_1.32.6

##	[141]	class_7.3-22	codetools_0.2-19
##	[143]	mvtnorm_1.2-4	utf8_1.2.4
##	[145]	lattice_0.22-5	curl_5.2.1
##	[147]	openssl_2.1.1	Rttf2pt1_1.3.12
##	[149]	survival_3.5-8	rmarkdown_2.26
##	[151]	munsell_0.5.0	e1071_1.7-14
##	[153]	GetoptLong_1.0.5	GenomeInfoDbData_1.2.9
##	[155]	iterators_1.0.14	impute_1.72.3
##	[157]	reshape2_1.4.4	gtable_0.3.4
##	[159]	extrafont_0.19	