

```
library('Seurat')
library('data.table')
library('Matrix')
library('tidyverse')
library('ggplot2')
library('ggpubr')
library('biomart')
library('cluster')
library('pheatmap')
library('glmGamPoi')
library(org.Hs.eg.db)
library(stringr)

Warning message:
"Strategy 'multiprocess' is deprecated in future (>= 1.20.0) [2020-10-30]. Instead, explicitly specify either 'multisession' (recommended) or 'multicore'. In the current R session, 'multiprocess' equals 'multicore'."
```

SPP1+ Mac matrix initialization

```
In [2]: Skin_all <- readRDS("~/Skin_Code_Final.RDS")
Kidney_all <- readRDS( 'Kidney_Code_Final.RDS')
All_endo <- readRDS("~/Endo_Final.Code.RDS")
Lung_all <- readRDS("~/Lung_all_Feb_20.RDS")
All_Heart <- readRDS("~/Heart_Code.RDS")
Liver <- readRDS("~/Liver_cd45-.RDS")

transcriptome_SPP1 <- list(All_Heart, Liver, Lung_all, All_endo, Kidney_all, Skin_all)
organ <- c('Heart', 'Liver', 'Lung', 'Endo', 'Kidney', 'Skin')
library('Seurat')
extract <- c('Diagnosis', 'orig.ident', 'nCount_RNA', 'nFeature_RNA', 'ribo.ratio', 'heam.ratio', 'mito.ratio', 'cluster_d', 'organ')
extract_liver <- c('Diagnosis', 'orig.ident', 'nCount_RNA', 'nFeature_RNA', 'ribo.ratio', 'heam.ratio', 'mito.ratio', 'cluster_d', 'Organ', 'Patient')

names(transcriptome_SPP1) <- organ
transcriptome_SPP1$Liver$orig.ident <- transcriptome_SPP1$Liver$Patient
for(i in 1:length(transcriptome_SPP1)){
  transcriptome_SPP1[[i]]$organ <- organ[[i]]

  if(i != 2){
    transcriptome_SPP1[[i]]$meta.data <- transcriptome_SPP1[[i]]$meta.data[, extract]
  } else {
    transcriptome_SPP1[[i]]$meta.data <- transcriptome_SPP1[[i]]$meta.data[, extract_liver]
  }
  transcriptome_SPP1[[i]] <- RenameCells(object = transcriptome_SPP1[[i]], add.cell.id = paste0(organ[[i]], '_'))
}

common_g <- rownames(transcriptome_SPP1[[1]]$RNA$counts)
for(i in 2:length(transcriptome_SPP1)){
  common_g <- intersect(common_g, rownames(transcriptome_SPP1[[i]]$RNA$counts))
}

SPP1 <- list()
for(i in 1:length(transcriptome_SPP1)){
  SPP1[[i]] <- transcriptome_SPP1[[i]][, transcriptome_SPP1[[i]]$cluster_d != c('SPP1', 'TREM2')]
  DefaultAssay(SPP1[[i]]) <- 'RNA'
  SPP1[[i]] <- c('SPP1', 'TREM2')] common_g, ]
}

}
```

Integrative SPP1+ macrophage atlas

```
In [36]: # for(i in 1:length(SPP1)){
#   SPP1[[i]] <- SCTransform( SPP1[[i]], vars.to.regress = c('orig.ident', 'mito.ratio'))
# }

# features <- SelectIntegrationFeatures(object.list = SPP1, nfeatures = 3000)

# SPP1 <- PrepSCTIntegration(object.list = SPP1, anchor.features = features)

# anchors <- FindIntegrationAnchors(object.list = SPP1, normalization.method = "SCT", anchor.features = features, dims = 1:30)
# SPP1 <- IntegrateData(anchorset = anchors, normalization.method = "SCT")
# SPP1 <- RunPCA(SPP1)

# DefaultAssay( SPP1) <- "integrated"
# SPP1 <- FindNeighbors(SPP1, dims = 1:9, k.param = 60L)
# SPP1 <- FindClusters(SPP1, resolution = seq(from = 0.2, to = .6, by = .05))

# DefaultAssay(SPP1) <- 'integrated'
# resolution <- colnames( SPP1$meta.data )[ startsWith(x =colnames( SPP1$meta.data ), prefix = 'integrated_snn_res')]

# silhouette <- list()
# i <- 1
# dist.matrix <- dist(x = Embeddings(object = SPP1[['pca']]][,1:9])
# for(sil in sort(resolution)) {
#   s <- silhouette(x = as.numeric(x = as.factor(x = SPP1$meta.data[, sil])), dist = dist.matrix)
#   silhouette[[s]] <- sum(s)
#   i <- i + 1
# }

# sil_score <- c()
# for( sil in silhouette) {
#   sil_score <- c(sil_score, mean(sil$clus.avg.widths))
# }

# to_plot <- data.frame('Score' = sil_score[1:length(seq(from = 0.2, to = .6, by = .05))], 'Res' = seq(from = 0.2, to = .6, by = .05))
# to_plot$Score <- round(to_plot$Score,digits = 2)

p1 <- ggpubr::ggscatter(data = to_plot, x = 'Res', y = 'Score', xlab = 'Resolution', ylab = 'Silhouette Score') +
  rotate_x_text(angle = 45) +
  theme(text = element_text(size = 19), plot.title = element_text(hjust = 0.5))

# SPP1 <- RunUMAP(SPP1, dims = 1:9, verbose = F)

p3 <- DimPlot(SPP1, group.by = 'Organ', label = T, label.size = 10) + NoLegend() + NoAxes()
p2 <- DimPlot(SPP1, group.by = 'integrated_snn_res.0.25', label = F, label.size = 10) + NoLegend() + NoAxes()

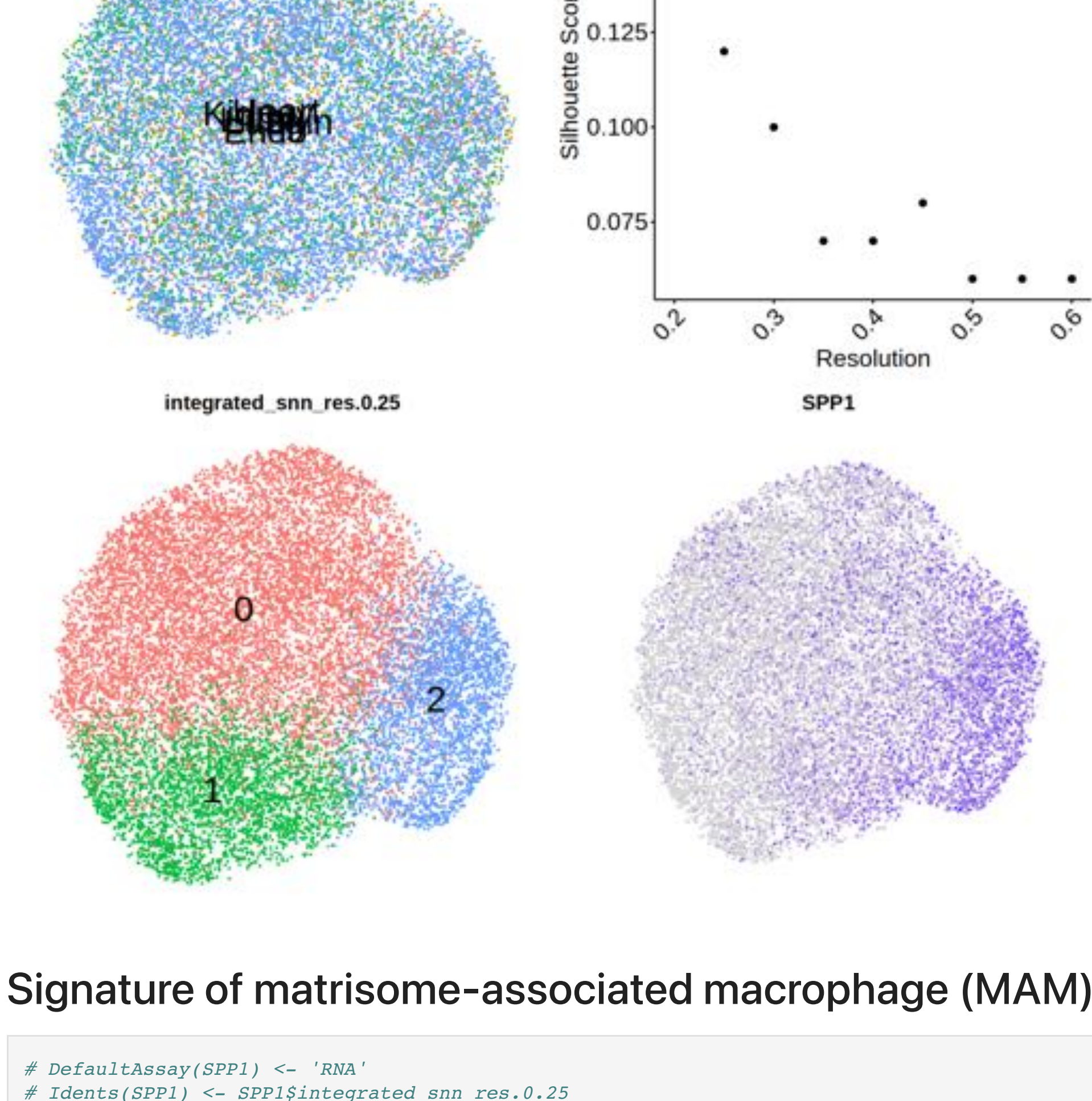
DefaultAssay(SPP1) <- 'RNA'
p4 <- FeaturePlot(SPP1, 'SPP1') + NoLegend() + NoAxes()

options(repr.plot.width=12, repr.plot.height=12)
CombinePlots(list(p3, p1, p2, p4), ncol = 2)
```

Warning message:
"CombinePlots is being deprecated. Plots should now be combined using the patchwork system."

Warning message:
"Graphs cannot be vertically aligned unless the axis parameter is set. Placing graphs unaligned."

Warning message:
"Graphs cannot be horizontally aligned unless the axis parameter is set. Placing graphs unaligned."



Signature of matrisome-associated macrophage (MAM)

```
In [22]: # DefaultAssay(SPP1) <- 'RNA'
# ident(spp1) <- SPP1$integrated_snn_res.0.25

# i <- 1
# MAM.marker <- list()
# for( org in organ) {
#   SPP1_tmp <- SPP1[, SPP1$Organ == org]
#   DefaultAssay( SPP1_tmp) <- 'RNA'
#   SPP1_tmp <- NormalizeData(SPP1_tmp)
#   MAM.marker[[i]] <- FindMarkers( SPP1_tmp, ident.1 = 2, logfc.threshold = -Inf, min.pct = -Inf, min.diff.pct = -Inf)
#   i <- i + 1
# }

# MAM_FC_avg <- MAM.marker[[1]]$avg_log2FC
# MAM_diff <- MAM.marker[[1]]$pct.1 - MAM.marker[[1]]$pct.2
# gene <- rownames( MAM.marker[[1]])

# for(i in 2:6) {
#   MAM.marker[[i]] <- MAM.marker[[i]]$gene, ]
#   MAM_FC_avg <- cbind(MAM_FC_avg, MAM.marker[[i]][, 'avg_log2FC'])
#   MAM_diff <- cbind(MAM_diff, MAM.marker[[i]]$pct.1 - MAM.marker[[i]]$pct.2)
# }
# rownames(MAM_FC_avg) <- gene

# MAM_signature <- data.frame('log2_FC_avg' = rowMeans( MAM_FC_avg), 'Diff_prop' = rowMeans( MAM_diff))
# MAM_signature$Diff_prop <- 1 - MAM_signature$log2_FC_avg - mean(MAM_signature$Diff_prop) /
#   sd(MAM_signature$Diff_prop)

# MAM_signature_FINAL <- MAM_signature[ MAM_signature$Diff_prop > 1.645 & MAM_signature$log2_FC_avg > .25, ]
# MAM_signature_FINAL <- MAM_signature_FINAL[ order(MAM_signature_FINAL$log2_FC_avg, decreasing = T), ]

# SPP1.m <- FindMarkers( SPP1, ident.1 = 2, logfc.threshold = -Inf, min.pct = -Inf, min.diff.pct = -Inf)
# quantile(SPP1.m$p_val_adj)
```

Top 10 MAM markers by fold change (log2)

Gene-set pathway enrichment analysis of MAM

```
# GO <- rhind( clusterProfiler::read.gmt('/mnt/storage/projects/huang_macrophage/gene_set/human/pathways/c2.cp.v7.5.1.symbols.gmt.txt'),
#           clusterProfiler::read.gmt('/mnt/storage/projects/huang_macrophage/gene_set/Human/Pathways/h.all.v7.5.1.symbols.gmt.txt'))
# GO$prefix <- str_split_fixed(GO$term, pattern = '_', n = 2)[,1]
# GO <- GO[GO$prefix != 'WP', ]
# GO$prefix <- NULL
# Term <- c()
# term <- str_split_fixed(GO$term, pattern = '_', n = 20)
# for( i in 1:length(term)[1:1]) {
#   Term <- c(Term, str_trim(paste0(term[i, 2:20], collapse = ' ')))
# }
# GO$term <- Term
```

Gene-set pathway enrichment analysis of MAM

```
In [24]: # GO <- rbind( clusterProfiler::read.gmt("~/mnt/storage/projects/huang_macrophage/gene_set/Human/Pathways/c2.cp.v7.5.1.symbols.gmt.txt"),
# clusterProfiler::read.gmt("~/mnt/storage/projects/huang_macrophage/gene_set/Human/Pathways/h.all.v7.5.1.symbols.gmt.txt"))
# GO$prefix <- str_split_fixed(GO$term, pattern = '_', n = 2)[,1]
# GO <- GO[GO$prefix != "WP", ]
# GO$prefix <- NULL
# Term <- c()
# term <- str_split_fixed(GO$term, pattern = '_', n = 20)
# for(i in 1:(dim(term)[1])) {
#   Term <- c(Term, str_trim(paste0(term[i, 2:20], collapse = ' ')))
# }
# GO$term <- Term

# MAM_signature <- MAM_signature[ order( MAM_signature$log2_FC_avg, decreasing = T), ]
# FC_avg <- MAM_signature$log2_FC_avg
# names(FC_avg) <- rownames(MAM_signature)
# FC_avg <- sort(FC_avg)[startsWith(names(FC_avg), prefix = 'PSM'), decreasing = T]

# set.seed(15)
# mac_1 <- clusterProfiler::GSEA(geneList= FC_avg, TERM2GENE = GO, padjustMethod = 'BH',
# minGSSize = 5, maxGSSize = 500, pvalueCutoff = 0.1, verbose = TRUE)
# mac_1$result <- mac_1$result[, order(mac_1$result$NES, decreasing = T), ]
# mac_1$result[, c('NES', 'p.adjust')][1:10, ]
```

	NES	p.adjust
	<dbl>	<dbl>
EPH EPHRIN SIGNALING	2.199161	1.894900e-07
VIBRIO CHOLERA INFECTION	2.199007	5.139473e-07
OXIDATIVE PHOSPHORYLATION	2.190857	1.009900e-08
DEGRADATION OF THE EXTRACELLULAR MATRIX	2.167248	7.019126e-07
RESPIRATORY ELECTRON TRANSPORT ATP SYNTHESIS BY CHEMOSMOTIC COUPLING AND HEAT PRODUCTION BY UNCOUPLING PROTEINS	2.157020	9.692996e-08
RESPIRATORY ELECTRON TRANSPORT	2.143049	1.548861e-07
EXTRACELLULAR MATRIX ORGANIZATION	2.121180	1.205780e-08
PARKINSONS DISEASE	2.072704	2.961638e-06
LCAM INTERACTIONS	2.069807	6.770453e-06
RECYCLING PATHWAY OF L1	2.065577	1.101113e-04

ECM and metabolic signature of MAM

```
In [90]: # tmp <- mac_1$result[, mac_1$result$p.adjust < .05 & mac_1$result$NES > 1.6, ][1:100, ]
# rownames(tmp) <- 1:100

# met <- c(14, 26, 29, 30, 99, 97, 95, 91, 79, 72, 32, 51)
# fib <- c(1, 4, 7, 11, 21, 22, 65, 34, 35, 38, 44, 45, 49, 61)

# met_sig <- unique(c(str_split_fixed(tmp$met, 'core_enrichment'), pattern = '\\\\', n = 200)))
# fib_sig <- unique(c(str_split_fixed(tmp$met, 'core_enrichment'), pattern = '\\\\', n = 200)))

saveRDS(list(met_sig, fib_sig, MAM_signature, MAM_signature_FINAL), "~/MAM_sig_Feb_26.RDS")
```

SPP1+ MAM+ enriched matrisome processes (NABA lab, UIC)

```
In [33]: NABA <- rbind( clusterProfiler::read.gmt("~/mnt/storage/projects/huang_macrophage/gene_set/Human/Pathways/c2.cp.v7.5.1.symbols.gmt.txt"),
clusterProfiler::read.gmt("~/mnt/storage/projects/huang_macrophage/gene_set/Human/Pathways/h.all.v7.5.1.symbols.gmt.txt"))
NABA <- NABA[ str_split_fixed(NABA$term, pattern = '_', n = 2)[,1] == "NABA", ]
NABA$term <- as.character(NABA$term)
NABA <- NABA[ NABA$term != "NABA_MATRISOME", "NABA_MATRISOME_ASSOCIATED", "NABA_CORE_MATRISOME", ]

mam_naba <- rownames( MAM_signature ) [ MAM_signature$log2_FC_avg > .25 & MAM_signature$Diff_prop_z > 1.645]
mam_naba <- clusterProfiler::enricher(gene = mam_naba, TERM2GENE = NABA, padjustMethod = 'BH', universe = rownames( MAM_signature),
pvalueCutoff = 1)

mam_naba <- rownames( MAM_signature ) [ MAM_signature$log2_FC_avg < -.25 & MAM_signature$Diff_prop_z < -1.975]
mam_naba <- clusterProfiler::enricher(gene = mam_naba, TERM2GENE = NABA, padjustMethod = 'BH', universe = rownames( MAM_signature),
pvalueCutoff = 1)

mam_naba$result[, c('qvalue', 'pvalue', 'geneID')]
```

	qvalue	pvalue	geneID
	<dbl>	<dbl>	<chr>
NABA_ECM_REGULATORS	0.09285285	0.02934001	MMP9/TIMP3/FAM20C/TGM2/CTSL/MMP19/CD109/ST14/CTSD/SERPINE1/ADAM9
NABA_ECM_AFFILIATED	0.28606479	0.18116804	SDC2/ANXA2/GPC4/ANXA11/CLEC4E/CLEC7A/CLEC10A/C1QC/C1QB/C1QA
NABA_ECM_GLYCOPROTEINS	0.76791409	0.75804575	SPP1/EMILIN2/CREL2
NABA_SECRETED_FACTORS	0.76791409	0.99802452	IL1RN/CCL2

SPP1+ MAM- enriched matrisome processes (NABA lab, UIC)

```
In [34]: mam_n_naba$result[, c('qvalue', 'pvalue', 'geneID')]
```

	qvalue	pvalue	geneID
	<dbl>	<dbl>	<chr>
NABA_ECM_AFFILIATED	0.1322600	0.04188233	CLEC12A/CLEC4E/CLEC7A/CLEC10A/C1QC/C1QB/C1QA
NABA_SECRETED_FACTORS	0.5966674	0.22778937	CXCL12/IL18/CXCL2/CXCL3/IL18/CCL42/CXCL8
NABA_ECM_GLYCOPROTEINS	0.7702362	0.9554856	FGL2
NABA_ECM_REGULATORS	0.7702362	0.97563248	SERPINF1/SERPINF1

MAM in disease v. control

```
In [35]: SPP1$Disease <- SPP1$Diagnosis
SPP1$Disease[ SPP1$Disease != 'Control' ] <- 'Disease'
SPP1$Disease <- factor( SPP1$Disease, levels = c('Disease', 'Control'))

SPP1$MAM <- 'MAM'
SPP1$MAM[SPP1$integrated_snn_res.0.25 != 2 ] <- 'SPP1+MAM-'

p1 <- DimPlot(SPP1, group.by = 'Disease') + theme_classic( base_line_size = .5, base_size = 20 ) + NoAxes()

to_plot <- melt(table(SPP1$Disease, SPP1$MAM) / rowSums(table(SPP1$Disease, SPP1$MAM))) * 100
p2 <- ggbarplot(data = to_plot, x = 'Var2', y = 'value', fill = 'Var1', position = position_dodge(0.9)) +
  xlab('') + ylab('% SPP1+ macrophage') + theme_classic( base_line_size = .5, base_size = 20 ) +
  rotate_x_text(15)

options(repr.plot.width=6, repr.plot.height=6)
DimPlot(SPP1, group.by = 'MAM', label = T, label.size = 15) + NoLegend() + NoAxes()

options(repr.plot.width=10, repr.plot.height=5)
CombinePlots(list( p1, p2), ncol = 2)
```

Warning message in melt(table(SPP1\$Disease, SPP1\$MAM)/rowSums(table(SPP1\$Disease, SPP1\$MAM))) :
"The melt generic in table.data.table has been passed a table and will attempt to redirect to the relevant reshape2 method; please note that reshape2 is deprecated and this redirection is now deprecated as well. To continue using melt methods from reshape2 while both libraries are attached, e.g. melt, you can p repend the namespace like reshape2::melt(table(SPP1\$Disease, SPP1\$MAM)/rowSums(table(SPP1\$Disease, SPP1\$MAM))) * 100). In the next version, this warning will become an error."

Warning message:
"CombinePlots is being deprecated. Plots should now be combined using the patchwork system."

Warning message:
"Graphs cannot be vertically aligned unless the axis parameter is set. Placing graphs unaligned."

Warning message:
"Graphs cannot be horizontally aligned unless the axis parameter is set. Placing graphs unaligned."



Significance of MAM macrophage in disease by over-representation test:

```
In [36]: over_t <- phyper( sum( SPP1$Disease == 'Disease' & SPP1$MAM == 'MAM' ) -1, sum(SPP1$Disease == 'Disease' ),
length(SPP1$MAM) - sum(SPP1$Disease == 'Disease' ), sum(SPP1$MAM == 'MAM' ),lower.tail = FALSE)

sprintf('p = %e', over_t)
```

p = 5.89171901689194e-45

by Organ

```
In [97]: SPP1$MAM <- 'MAM'
SPP1$MAM[SPP1$integrated_snn_res.0.25 != 2] <- 'SPP1+MAM-'

In [98]: # for(i in 1:length(transcriptome_SPP1)) {
#   transcriptome_SPP1[[i]]$cluster_d <- as.character( transcriptome_SPP1[[i]]$cluster_d)
#   transcriptome_SPP1[[i]]$cluster_d <- colnames(transcriptome_SPP1[[i]]) %in% colnames(SPP1) | SPP1$MAM == 'MAM' | i == 'MAM'
# }

to_plot <- list()
N <- c(0, 0, 0, 20, 20, 18)
D <- list( c('Control', 'DCM', 'ICM'), c('Control', 'Cirrhosis'), c('Control', 'IPF'), 'SSC', 'SSC'),
c('Control', 'Endometriosis'), c('Control', 'AKI', 'CKD'), c('Control', 'SSC', 'Keloid'))

D <- list( c('Control', 'DCM', 'ICM'), c('Control', 'Cirrhosis'), c('Control', 'IPF'), 'SSC', 'SSC'),
c('Control', 'Endometriosis'), c('Control', 'AKI', 'CKD'), c('Control', 'SSC', 'Keloid'))

for(i in 1: length(transcriptome_SPP1)) {

  MAM <- table( transcriptome_SPP1[[i]]$orig.ident, transcriptome_SPP1[[i]]$cluster_d ) / rowSums(table(transcriptome_SPP1[[i]]$orig.ident, transcriptome_SPP1[[i]]$cluster_d))
  transcriptome_SPP1[[i]]$orig.ident[ duplicated( transcriptome_SPP1[[i]]$orig.ident ) ] <- transcriptome_SPP1[[i]]$orig.ident[ duplicated( transcriptome_SPP1[[i]]$orig.ident ) ]
  tmp <- data.frame( MAM = MAM, 'Diagnosis' = Diagnosis)
  tmp <- tmp[ tmp$Diagnosis != 'Control' ]
  tmp$Diagnosis[ tmp$Diagnosis == 'Control' ] <- paste0(tmp$Diagnosis[ tmp$Diagnosis == 'Control' ], '_', organ[[i]])

  if(i == 1) {
    all_pat <- tmp
  } else {
    all_pat <- rbind(all_pat, tmp)
  }
}

D <- c('Control_Heart', 'DCM', 'ICM', 'Control_Liver', 'Cirrhosis', 'Control_Lung', 'IPF', 'SSC', 'SSC',
'Control_Endo', 'Endometriosis', 'Control_Kidney', 'AKI', 'CKD', 'Control_Skin', 'SSC', 'Keloid')

Com <- list( c('DCM', 'Control_Heart'), c('ICM', 'Control_Heart'),
c('Cirrhosis', 'Control_Liver'), c('IPF', 'Control_Lung'), c('SSC', 'Control_Lung'),
c('Endometriosis', 'Control_Kidney'), c('AKI', 'Control_Kidney'), c('CKD', 'Control_Kidney'),
c('SSC', 'Control_Skin'), c('Keloid', 'Control_Skin'))

all_pat$Diagnosis <- factor(all_pat$Diagnosis, levels = D)
all_pat$MAM <- 100 * all_pat$MAM

options(repr.plot.width=20, repr.plot.height=8)
ggboxplot( data = all_pat, x = 'Diagnosis', y = 'MAM', add = 'jitter' ) +
  theme_classic(base_line_size = .5, base_size = 25) + ylab('% SPP1+ macrophage') + rotate_x_text(30) + xlab('') +
  stat_compare_means( comparisons = Com, method = 'wilcox.test', size = 6, bracket.size = 0.1, tip.length = 0, step.increase = 0.15)
```

The following 'from' values were not present in 'x': 1, 14

The following 'from' values were not present in 'x': 34-10184, 34-10187, 27-10039, 28-10051, 31-10001, 29-10008, 31-10000, PR018-1, PR018-4, PR027, PR03 8, PR018-05, PR018-05, PR018-05, Sample1153-B01, Sample1157-B01, Sample1157-B02, Sample1157-B03, Sample1158-B01, Sample1158-B02, Sample1158-B03, Sample1162-B01, Sample1162-B02, CDM9, CDM1, CDP1, CDP2

The following 'from' values were not present in 'x': NF3.matrix, pt03032, pt01047, GVHD, pt005, pt01004, pt02001, pt01007, Ctr1002, Ctr1004, Ctr1005, Ctr1006, Ctr1007, pt01001, pt01002, pt02003, pt03001, pt01011, pt01010, pt02004, Ctr1008, pt03002, pt02006, pt01013, Ctr1001, pt03004, Ctr1013, Ctr1014, Ctr1012, Ctr1009, Ctr1010, pt03005, pt03011, pt03012, Ctr1018, pt01019, pt03016, Ctr1014, pt02010, pt02009, pt03017, pt01030, pt01031, Ctr1023, pt03019, Ctr1029, pt01 014, Ctr1013, Ctr1037, pt01046

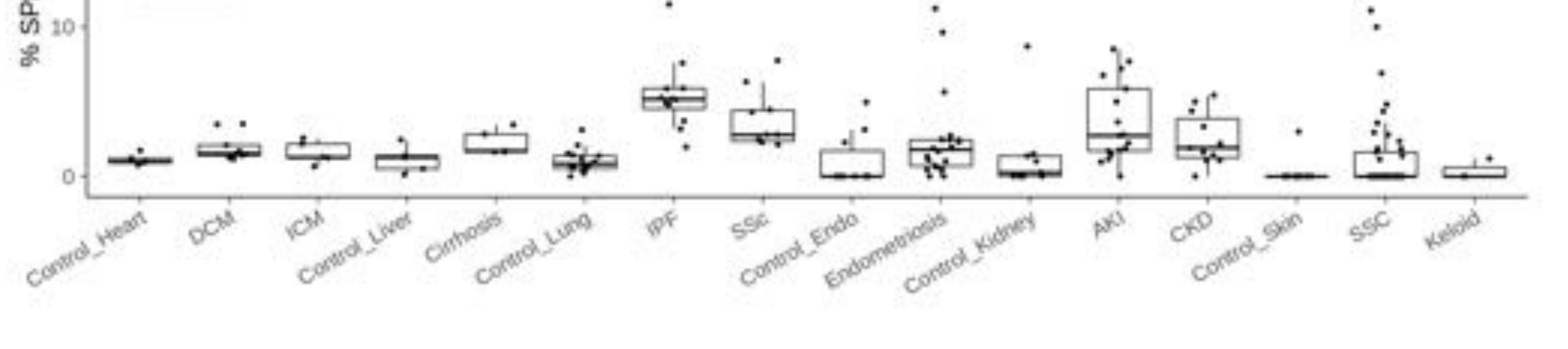
Warning message in wilcox.test.default(c(1.94174757281553, 1.01010101010101, 1.86170212765957, :
"cannot compute exact p-value with ties"

Warning message in wilcox.test.default(c(3.63636363636364, 0, 5, 5.86206896551724, :
"cannot compute exact p-value with ties"

Warning message in wilcox.test.default(c(4.37710437710438, 1.42857142857143, 1.89873471721519, :
"cannot compute exact p-value with ties"

Warning message in wilcox.test.default(c(11.1111111111111, 3.57142857142857, 0, :
"cannot compute exact p-value with ties"

Warning message in wilcox.test.default(c(1.19047619047619, 0, 0), c(0, 0, 0, 0, :
"cannot compute exact p-value with ties"



```
In [46]: #saveRDS( SPP1, "~/MAM_FEB_25_2023.RDS")
# saveRDS(transcriptome_SPP1, "~/Transcriptome_SPP1_Feb_26.RDS")
```

Error in saveRDS(transcriptome_SPP1, "~/Transcriptome_SPP1_Feb_26.RDS") : error writing to connection
Traceback:

```
1. saveRDS(transcriptome_SPP1, "~/Transcriptome_SPP1_Feb_26.RDS")
```