

Analysis of gse40279 by MEAL and limma

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這次做了什麼：

- 修改GEOquery套件
- 年齡分層
- QQplot
- beta-value distribution of a specific probe
- number of significant genes
- 修正limma design部分

修改GEOquery套件

```
2  ### Part 1
3  ## Download gse40279 and run analysis by using "MEAL" package (from original code 4.R)
4  library(MEAL)
5  library(minfi)
6  library(limma)
7  library(ggplot2)
8
9  # Install remotes from CRAN
10 install.packages("remotes")
11 # Download modified GEOquery package from my github
12 # by using function(install_github()) from 'remotes' package.
13 library(remotes)
14 install_github("curryhank08/GEOquery_with_modifiable_timeout_seconds", force = TRUE)
15 # Load modified GEOquery
16 library(GEOquery)
17 # Setting the max timeout_seconds
18 options(timeout=100000)
19 # Check the input timeout_seconds
20 getOption("timeout")
```

修改GEOquery套件

Since GEOquery_with_modifiable_timeout_seconds/R/getGEOfile.R was modified in line 185 as :

```
timeout_seconds <- max(getOption("timeout"), 120)
```

, compared to original code :

```
timeout_seconds <- 120
```

修改GEOquery套件

```
22 # Download GSE40279 by a fuction getGEO() from modified GEOquery package.
23 gse40279 <- getGEO("GSE40279", GSEMatrix = TRUE, AnnotGPL = TRUE)
24 gse40279_matrix <- gse40279[[1]]
25
26 data <- exprs(gse40279_matrix)
```

```
> # Download GSE40279 by a fuction getGEO() from modified GEOquery package.
> gse40279 <- getGEO("GSE40279", GSEMatrix = TRUE, AnnotGPL = TRUE)
Found 1 file(s)
GSE40279_series_matrix.txt.gz
|-----|
|=====|
Annotation GPL not available, so will use submitter GPL instead
|-----|
|=====|
> gse40279_matrix <- gse40279[[1]]
> data <- exprs(gse40279_matrix)
```

年齡分層

```
28 # Create age categories
29 age <- pData(gse40279_matrix)$characteristics_ch1
30
31 # Remove "age (y):" and convert to numeric
32 age <- sub("^\\s*age \\\(y\\): ", "", age)
33 age <- as.numeric(age)
34
35 # The ^ character denotes the start of the string,
36 # \\s* matches any number of leading whitespace characters,
37 # and "age \\\(y\\): " matches the exact string "age (y): ".
```

Values	
age	chr [1:656] "age (y): 67" "age (y): 89" "age (y): 66" "age (y): 64" "age (y): 62" "ag...

Values	
age	chr [1:656] "67" "89" "66" "64" "62" "87" "73" "75" "73" "83" "82" "48" "77" "54" "63...

Values	
age	num [1:656] 67 89 66 64 62 87 73 75 73 83 ...

年齡分層

```
39 # Assign age values to a new column in pData of gse40279_matrix
40 pData(gse40279_matrix)$age <- age
41
42 # Define age categories based on specific age ranges
43 age_categories <- cut(age,
44                       breaks = c(0, 30, 65, Inf),
45                       labels = c("Young", "Middle", "Old"),
46                       include.lowest = TRUE)
47
48 # Assign age categories to the pData of gse40279_matrix
49 pData(gse40279_matrix)$age_category <- age_categories
```

Values	
age	num [1:656] 67 89 66 64 62 87 73 75 73 83 ...
age_categories	Factor w/ 3 levels "Young","Middle",...: 3 3 3 2 2 3 3 3 3 3 ...

age	double [656]	67 89 66 64 62 87 ...
age_category	factor	Factor with 3 levels: "Young", "Middle", "Old"

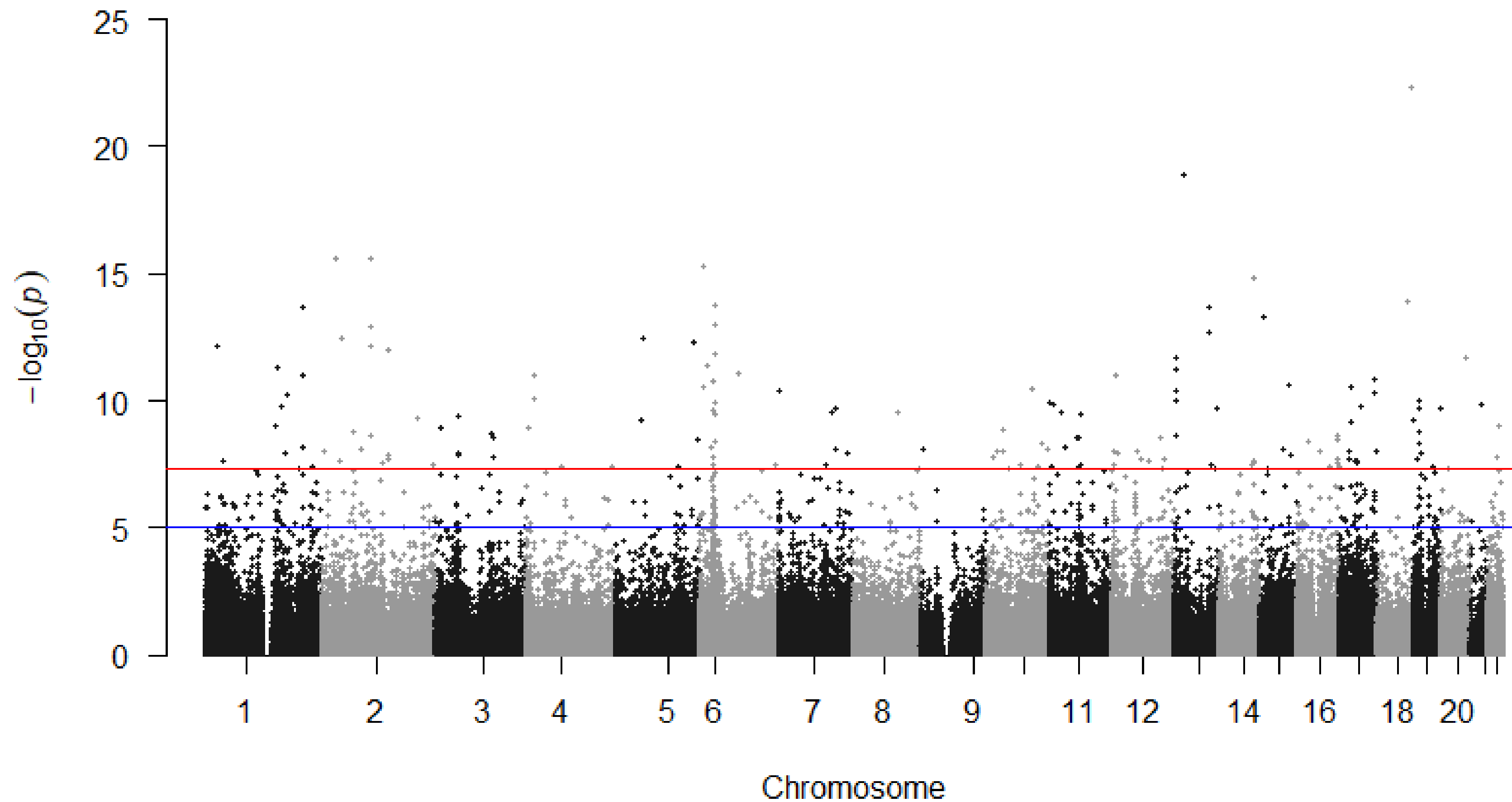
```
54 # Run MEAL pipeline on the categorized data
55 res <- runPipeline(set = gse40279_matrix,
56                   variable_names = "age_category",
57                   betas = TRUE,
58                   analyses = c("DiffMean", "DiffVar"))
59
60 # Extract the result of the DiffMean analysis
61 result_Meal <- getProbeResults(res, rid = 1,
62                                fNames = c("UCSC_RefGene_Name", "RANGE_START", "CHR", "ID"))
63
```


all_for_gse40279.R ×														gse40279_matrix ×														result_Meal ×																											
← →														Filter														Q																											
	logFC	CI.L	CI.R	AveExpr	t	P.Value	adj.P.Val	B	SE	UCSC_RefGene_Name	RANGE_START	CHR	ID																																										
cg16762684	-0.045591731	-0.05387128	-0.037312186	0.044272495	-10.812632	3.477780e-25	1.645108e-19	46.095787	0.0184282588	MBP;MBP	74820493	18	cg16762684																																										
ch.13.39564907R	-0.042191633	-0.05071966	-0.033663608	0.054817885	-9.714706	6.233682e-21	1.474372e-15	36.402998	0.0057294086		40666907	13	ch.13.39564907R																																										
cg16867657	0.137129897	0.10872076	0.165539030	0.669858102	9.478202	4.655981e-20	7.341457e-15	34.415452	0.0092140797	ELOVL2	11044877	6	cg16867657																																										
cg22454769	0.155976425	0.12268996	0.189262894	0.594609202	9.201169	4.684294e-19	5.539576e-14	32.134738	0.0126058103	FHL2;FHL2;FHL2;FHL2	106015767	2	cg22454769																																										
ch.2.30415474F	-0.040785354	-0.04984282	-0.031727886	0.060795178	-8.841974	8.655508e-18	8.188699e-13	29.255641	0.0112185117		30561970	2	ch.2.30415474F																																										
cg19283806	-0.150355364	-0.18473114	-0.115979588	0.221358329	-8.588517	6.425004e-17	5.065409e-12	27.278400	0.0176595967	CCDC102B	66389420	18	cg19283806																																										
ch.14.97331099F	-0.024964811	-0.03069983	-0.019229789	0.029171977	-8.547616	8.841685e-17	5.809092e-12	26.963607	0.0065458235		98261346	14	ch.14.97331099F																																										
cg10501210	-0.295290645	-0.36323364	-0.227347650	0.528237299	-8.534081	9.824397e-17	5.809092e-12	26.859705	0.0183575944		207997020	1	cg10501210																																										
cg04875128	0.169496742	0.12963640	0.209357085	0.297141649	8.349724	4.075232e-16	2.141915e-11	25.457582	0.0143117331	OTUD7A	31775895	15	cg04875128																																										
ch.6.33611621F	-0.034474579	-0.04261102	-0.026338135	0.044591037	-8.319862	5.119659e-16	2.421773e-11	25.232787	0.0014138876		33503643	6	ch.6.33611621F																																										
cg26685941	-0.101719705	-0.12577251	-0.077666898	0.164852036	-8.304072	5.774591e-16	2.483253e-11	25.114192	0.0063653511	ABCC4;ABCC4	95952902	13	cg26685941																																										
cg06639320	0.094406356	0.07169578	0.117116938	0.474138942	8.162530	1.685386e-15	6.643708e-11	24.059225	0.0066447751	FHL2;FHL2;FHL2;FHL2	106015739	2	cg06639320																																										
cg02286081	-0.093360274	-0.11615877	-0.070561775	0.145205710	-8.040955	4.180408e-15	1.521135e-10	23.164899	0.0053779168	HLA-DPB1	33043841	6	cg02286081																																										
ch.2.105901354F	-0.043535283	-0.05419391	-0.032876659	0.048728316	-8.020326	4.871888e-15	1.646121e-10	23.014237	0.0033796714		106534922	2	ch.2.105901354F																																										
cg05412028	-0.070916658	-0.08839167	-0.053441642	0.054107938	-7.968608	7.141141e-15	2.252002e-10	22.637918	0.0033853822	ABCC4;ABCC4	95952937	13	cg05412028																																										
cg05207048	-0.062891085	-0.07864596	-0.047136208	0.133862202	-7.838372	1.854277e-14	5.197220e-10	21.699173	0.0083986743	ODZ2	167513456	5	cg05207048																																										
ch.2.42601115R	-0.025019983	-0.03128855	-0.018751417	0.021582864	-7.837374	1.867788e-14	5.197220e-10	21.692032	0.0078758103		42747611	2	ch.2.42601115R																																										
cg00573770	0.183384137	0.13866558	0.136103603	0.377739203	7.738057	3.823808e-14	1.007562e-09	20.084841	0.0030073318	7EB3;7EB3;7EB3	145278485	3	cg00573770																																										
Showing 1 to 18 of 473,034 entries, 13 total columns																																																							

```
67 library(qqman)
68 # function from qqman to plot manhattan
69 result_Mea1$CHR <- as.numeric(result_Mea1$CHR)
70 manhattan(result_Mea1,
71           main = "Manhattan Plot for gse40279 (Analysis of DiffMean on MEAL)",
72           cex = 0.6,
73           ylim = c(0, 25),
74           chr="CHR",
75           bp="RANGE_START",
76           snp= "ID",
77           p="P.Value" )
78
```

MEAL

Manhattan Plot for gse40279 (Analysis of DiffMean on MEAL)



```
84 # Create a new age category with 2 levels (old and Young)
85 new_age_categories <- factor(age_categories, levels = c("old", "Young"))
86 new_age_categories <- na.omit(new_age_categories)
```

```
> new_age_categories
 [1] old    old    old    <NA>   <NA>
 [7] old    old    old    old    old
[13] old    <NA>   <NA>   old    old
[19] old    <NA>   old    old    old
[25] old    old    old    <NA>   old
[31] old    old    old    old    old
[37] old    old    old    old    old
[43] old    old    old    old    old
[49] old    <NA>   old    old    old
[55] old    old    <NA>   old    <NA>
```

```
> new_age_categories
 [1] old    old    old    old    old
[12] old    old    old    old    old
[23] old    old    old    old    old
[34] old    old    old    old    old
[45] old    old    old    old    old
[56] old    old    old    old    old
[67] old    old    old    old    old
[78] old    old    old    old    old
[89] old    old    old    old    old
```

```
88 # Extract samples belonging to "Young" and "old" age categories
89 subset_forMeal_YO <- gse40279_matrix[, age_categories %in% c("Young", "old")]
90 subset_forMeal_YO_data <- exprs(subset_forMeal_YO)
91 # Assign the new age category to pData of the subset
92 pData(subset_forMeal_YO)$new_age_category <- new_age_categories
93 # subset samples info
94 subset_forMeal_YO_samplesinfo <- pData(subset_forMeal_YO)
```

all_for_gse40279.R ✕

subset_forMeal_YO ✕

subset_forMeal_YO_data ✕

subset_forMeal_YO_samplesinfo ✕

← → |  Show Attributes

Name	Type	Value
subset_forMeal_YO	S4 [473034 x 327] (Biobase::Exprn	S4 object of class ExpressionSet
experimentData	S4 (Biobase::MIAME)	S4 object of class MIAME
assayData	environment [1]	<environment: 0x0000021730862310>
phenoData	S4 [327 x 44] (Biobase::Annotate	S4 object of class AnnotatedDataFrame
featureData	S4 [473034 x 37] (Biobase::Annot	S4 object of class AnnotatedDataFrame
annotation	character [1]	'GPL13534'
protocolData	S4 [327 x 0] (Biobase::Annotated	S4 object of class AnnotatedDataFrame
.__classVersion__	list [4] (Biobase::Versions)	List of length 4

age_category	factor	Factor with 3 levels: "Young", "Middle", "Old"
new_age_category	factor	Factor with 2 levels: "Old", "Young"

	GSM989827	GSM989828	GSM989829	GSM989832	GSM989833	GSM989834	GSM989835	GSM989836
cg000000029	0.464197400	0.454883300	0.4857639000	0.499917500	0.485851800	0.5124422000	0.518155200	0.471111100
cg000000108	0.941090700	0.939033200	0.9188020000	0.950542700	0.925855000	0.9413304000	0.938527900	0.938527900
cg000000109	0.911182100	0.596454800	0.8703333000	0.898493200	0.893972300	0.8920096000	0.900840600	0.888888900
cg000000165	0.132013700	0.206916700	0.1628613000	0.224092900	0.400488500	0.1945532000	0.134710300	0.202020200
cg000000236	0.717861100	0.723935400	0.7191964000	0.829191700	0.723781700	0.6951424000	0.731872000	0.747474700
cg000000289	0.686520900	0.619084400	0.6356780000	0.692076100	0.676272000	0.6746192000	0.711829700	0.707070700
cg000000292	0.805002800	0.814671900	0.8243358000	0.849451500	0.793246400	0.8288583000	0.810585300	0.777777800
cg000000321	0.228243900	0.310878800	0.2632152000	0.332558700	0.220229300	0.3454595000	0.330990600	0.353535400
cg000000363	0.338483500	0.418997600	0.4247363000	0.337284800	0.368749600	0.3785781000	0.383985800	0.373737400
cg000000622	0.016507540	0.005746650	0.0121974700	0.004045347	0.012899920	0.0123996000	0.008327145	0.007070700
cg000000658	0.810140000	0.778277500	0.7688435000	0.853309900	0.831434300	0.8080302000	0.796260500	0.828282800
cg000000714	0.177980500	0.144453800	0.1851251000	0.195454600	0.165168600	0.1496276000	0.184130300	0.202020200
cg000000721	0.921818000	0.907528900	0.9162778000	0.917347600	0.919770400	0.9251508000	0.937031700	0.938527900
cg000000734	0.093029850	0.087868610	0.0900477200	0.092497910	0.080601250	0.0793425000	0.106757600	0.111111100

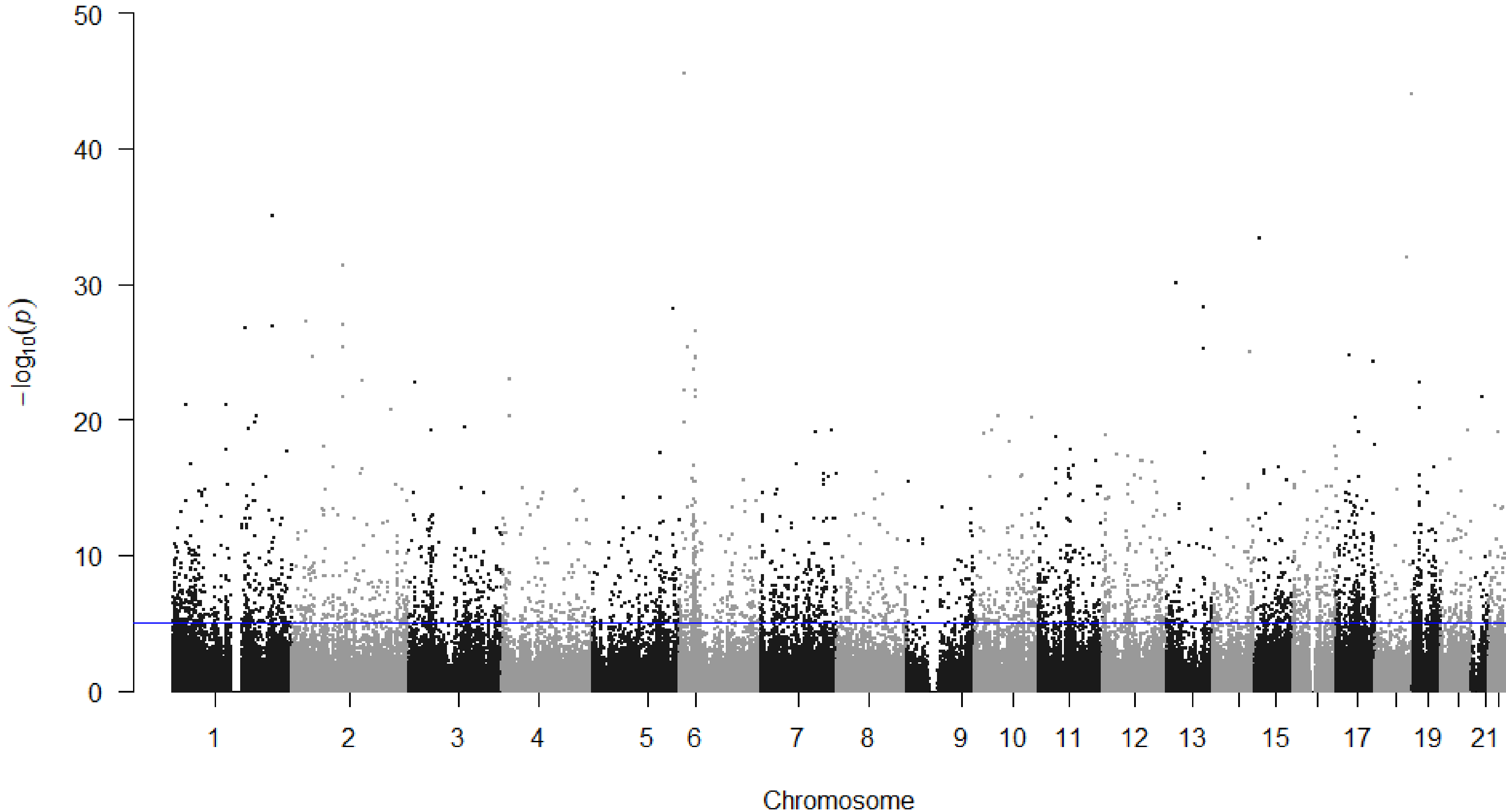

```
97 # Run MEAL pipeline on the subset
98 res_sub_YO <- runPipeline(set = subset_forMeal_YO,
99                           variable_names = "new_age_category",
100                           betas = TRUE,
101                           analyses = c("DiffMean", "DiffVar"))
102
103 # Extract the result of the DiffMean analysis
104 result_Meal_sub_YO <- getProbeResults(res_sub_YO, rid = 1,
105                                       fNames = c("UCSC_RefGene_Name", "RANGE_START", "CHR", "ID"))
106
107 # Remove rows with missing values
108 result_Meal_sub_YO_clean <- na.omit(result_Meal_sub_YO)
```

```
111 ## manhattan plot for subset YO
112 install.packages("qqman") # if you have not installed
113 library(qqman)
114
115 # Extract data for manhattan plot
116 res_M_YO_manhattan <- result_Meal_sub_YO_clean
117
118 # Convert CHR column to numeric
119 res_M_YO_manhattan$CHR <- as.numeric(res_M_YO_manhattan$CHR)
120
121 # Remove rows with missing values
122 res_M_YO_manhattan_clean <- na.omit(res_M_YO_manhattan)
```

```
125 # function from qqman to plot manhattan
126 manhattan(res_M_YO_manhattan_clean,
127           main = "Manhattan Plot for gse40279 (subset_YO) (Analysis of DiffMean on MEAL)",
128           cex = 0.3,
129           ylim = c(0, 25),
130           chr="CHR",
131           bp="RANGE_START",
132           snp= "ID",
133           p="P.Value",
134           genomewideline = FALSE,
135           suggestiveline = -log10(1e-05))
```

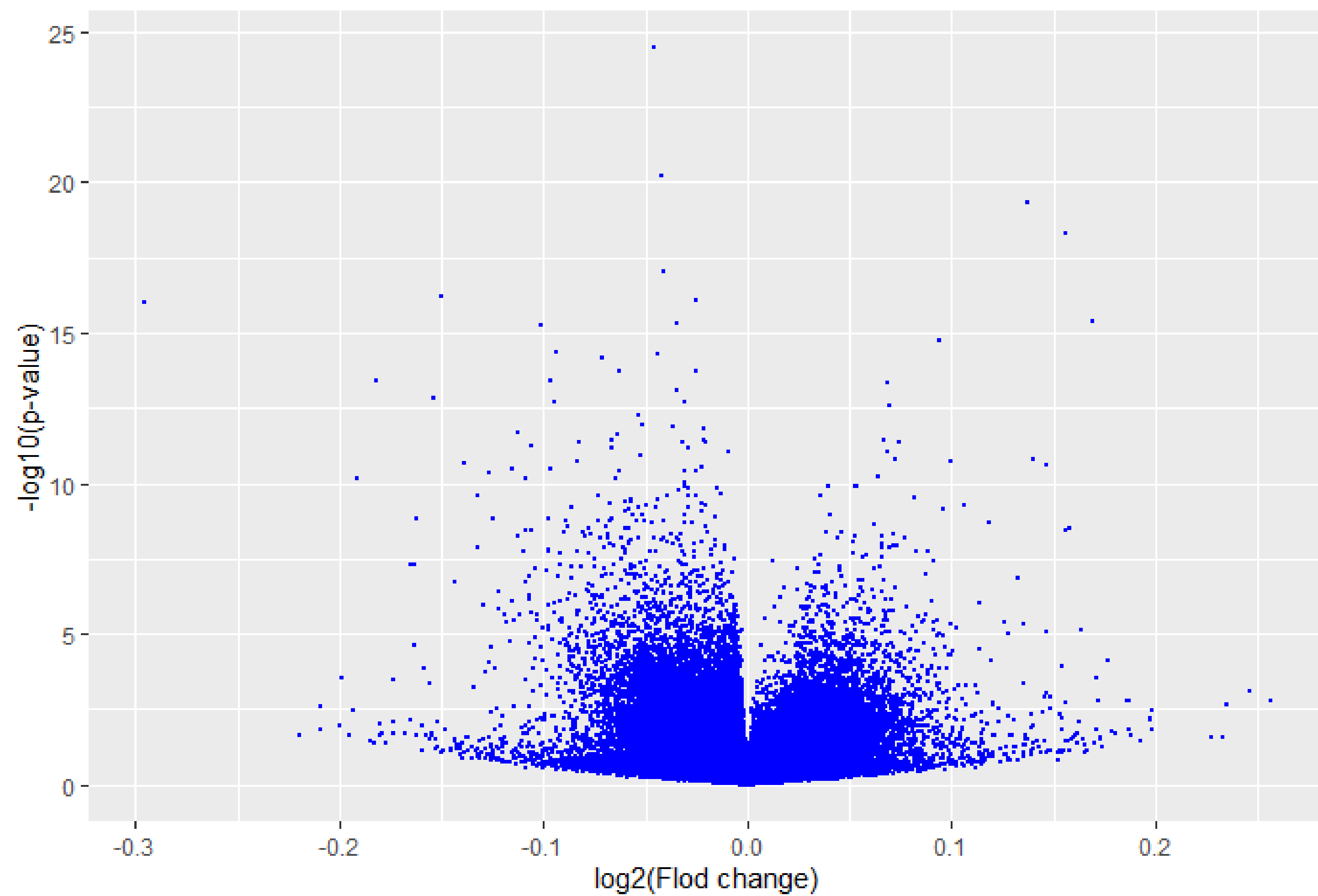
MEAL

Manhattan Plot for gse40279 (subset_YO) (Analysis of DiffMean on MEAL)

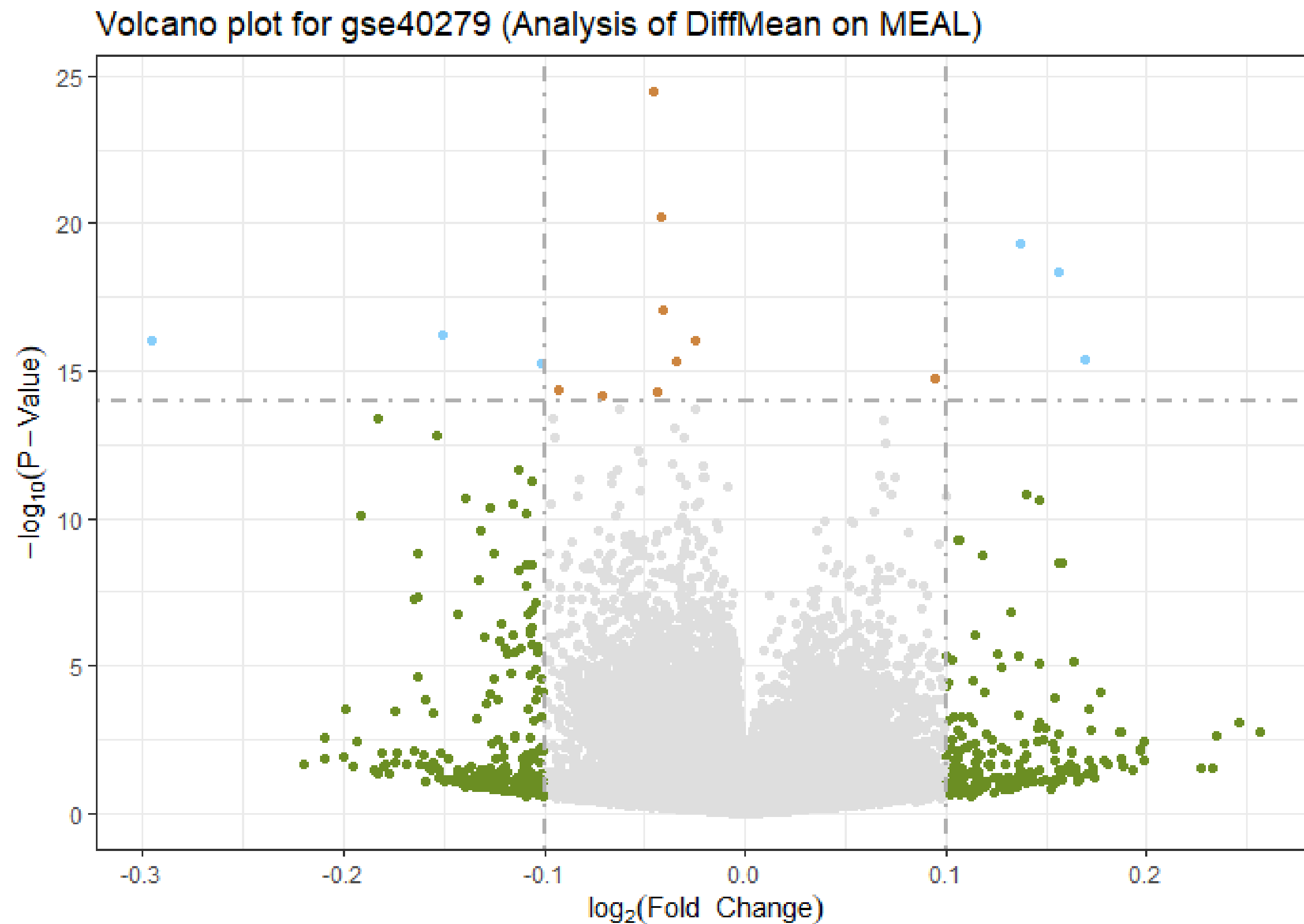


```
135
136 ## volcano plot
137 # Extract data for volcano plot (same as res_manhattan)
138 res_M_volcano <- result_Meal
139 # Remove rows with missing values
140 res_M_volcano_clean <- na.omit(res_M_volcano)
141
142 # Add log-transformed p-value column to res_M_volcano_clean
143 res_M_volcano_clean$neg_logP <- -log10(res_M_volcano_clean$P.Value)
144
145 # Create volcano plot
146 ggplot(res_M_volcano_clean, aes(x = logFC, y = neg_logP)) +
147   geom_point(size = 0.5, color = "BLUE")+
148   ggtitle("Volcano plot for gse40279 (Analysis of DiffMean on MEAL)") +
149   labs(x="log2(Fold change)", y="-log10(p-value)")
```

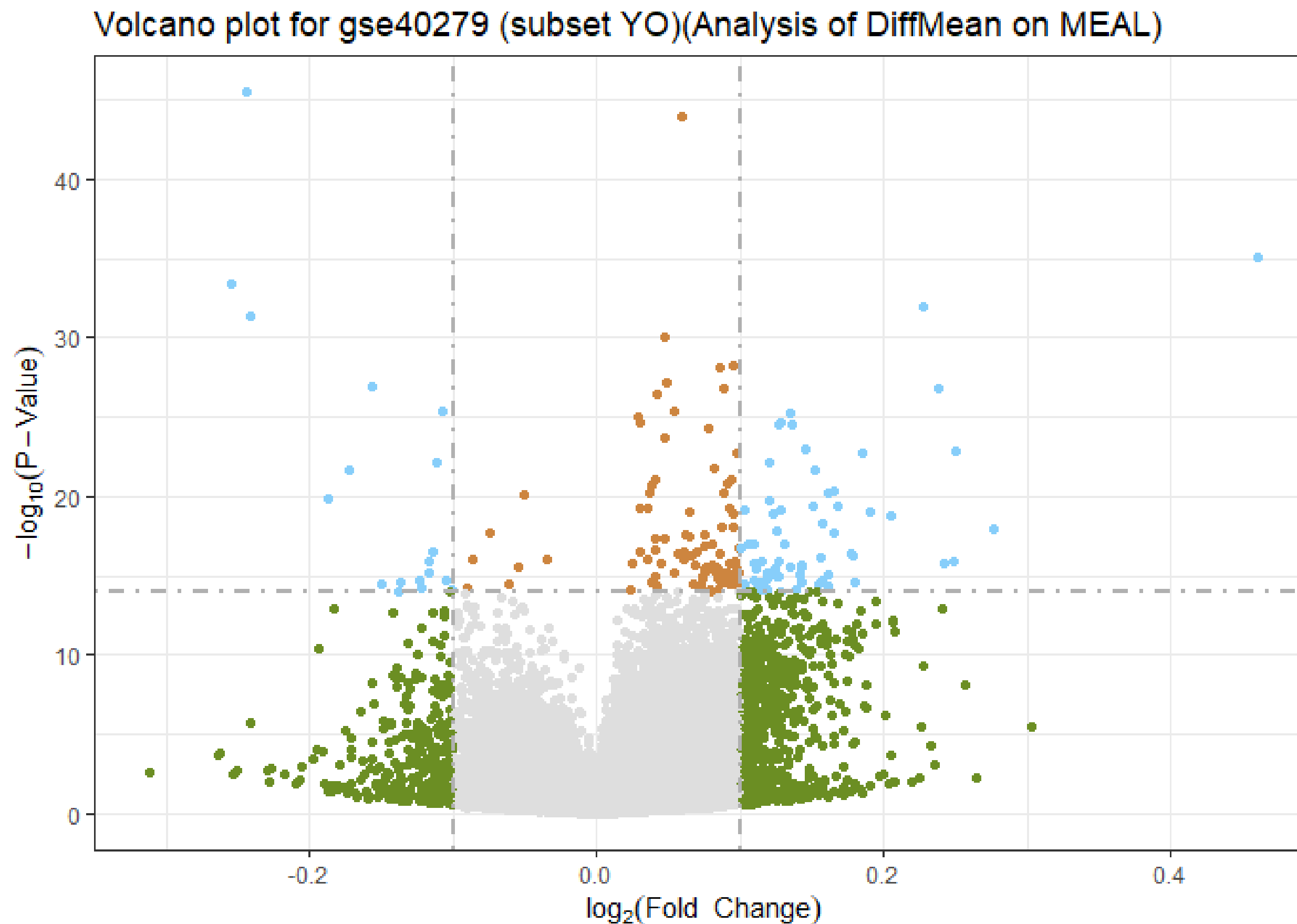
Volcano plot for gse40279 (Analysis of DiffMean on MEAL)



```
151 # Way 2 to plot volcano
152 plot(res, rid = "DiffMean", type = "volcano", tPV = 14, tFC = 0.1,
153       show.labels = FALSE) + ggtitle("Volcano plot for gse40279 (Analysis of DiffMean on MEAL)")
154
```

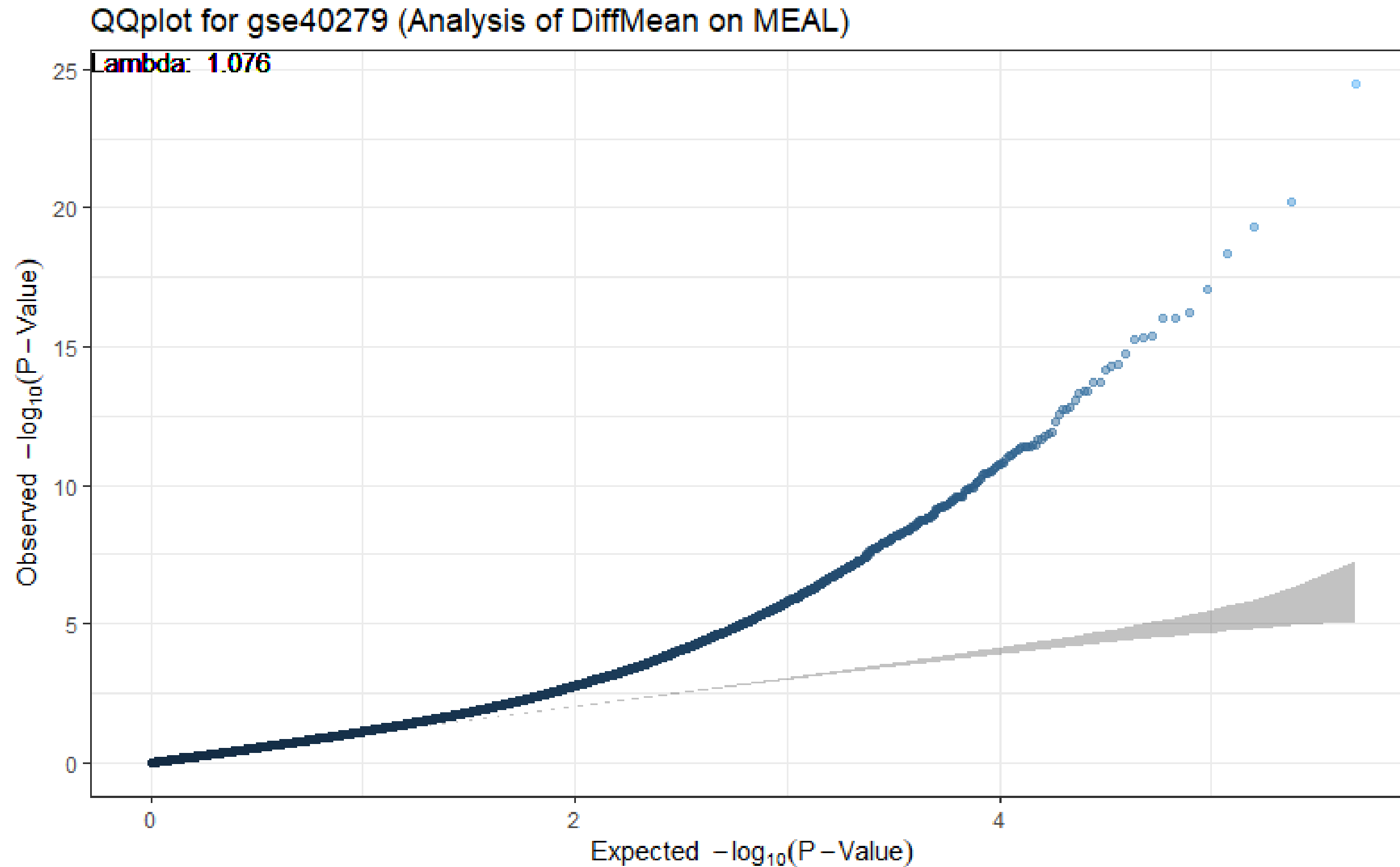


```
155 # Way 2 to plot volcano
156 plot(res_sub_YO, rid = "DiffMean", type = "volcano", tPV = 14, tFC = 0.1,
157       show.labels = FALSE) + ggtitle("Volcano plot for gse40279 (subset YO)(Analysis of DiffMean on MEAL)")
```



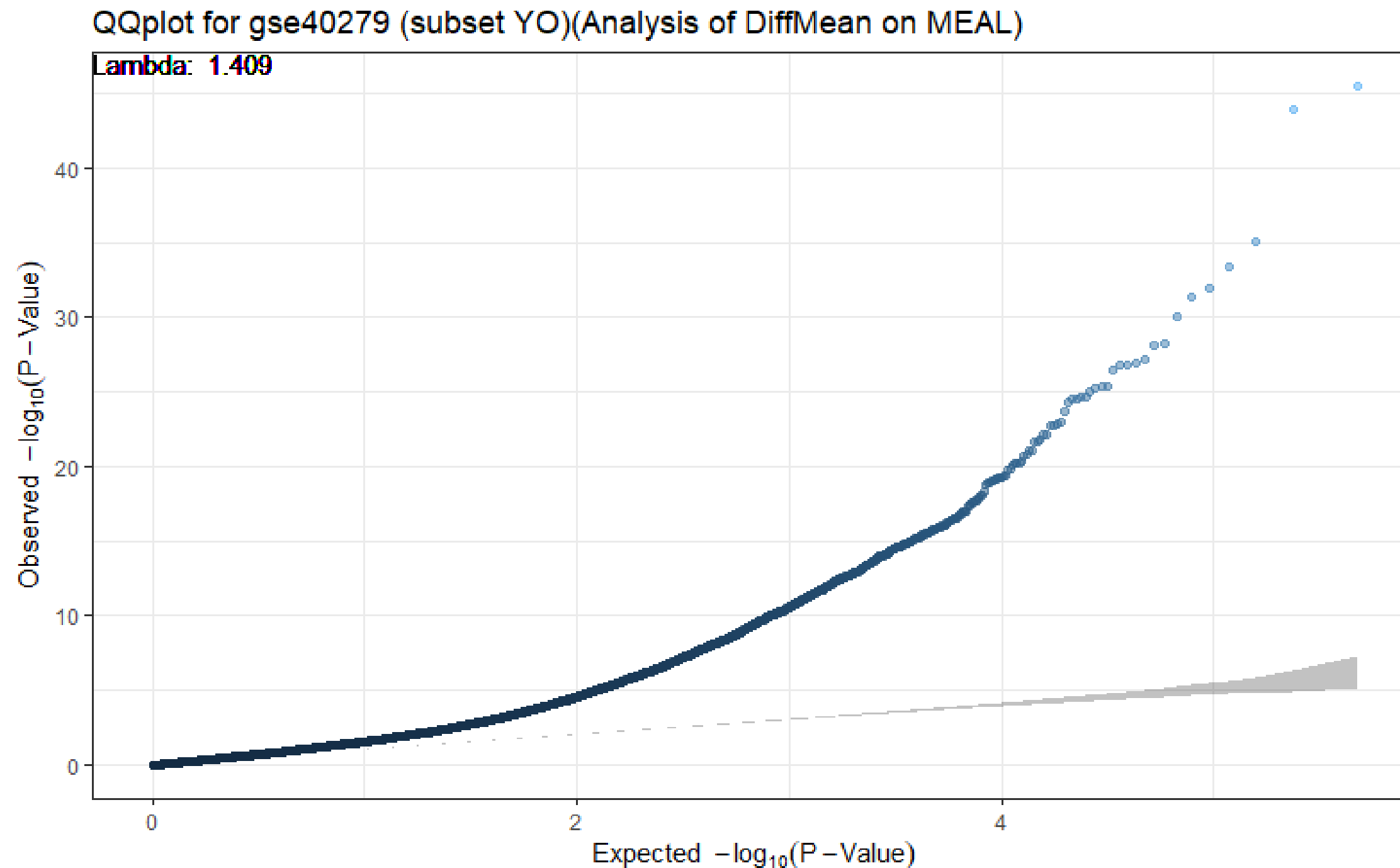
QQplot

```
184 # QQ plot for all
185 plot(res, rid = 1, type = "qq") |> ggtitle("QQplot for gse40279 (Analysis of DiffMean on MEAL)")
```



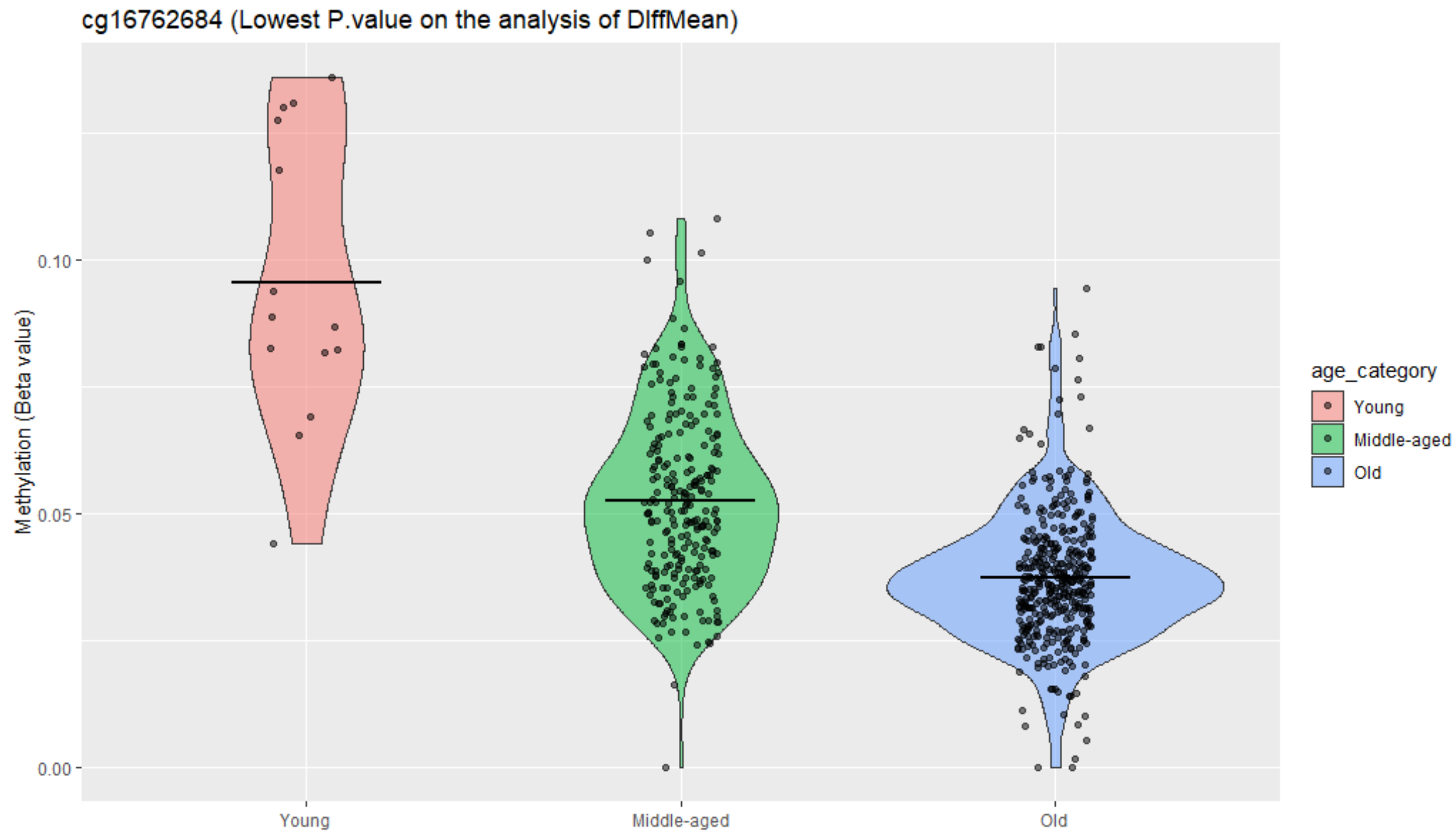
QQplot

```
187 # QQ plot for subset YO
188 plot(res_sub_YO, rid = 1, type = "qq")
189 + ggtitle("QQplot for gse40279 (subset YO)(Analysis of DiffMean on MEAL)")
190
```



beta-value distribution of a specific probe

```
194 # Plot the beta values distribution of a CpG
195 plotFeature(set = gse40279_matrix, feat = "cg16762684", variables = "age_category") +
196   ggtitle("cg16762684 (Lowest P.value on the analysis of DiffMean)") +
197   ylab("Methylation (Beta value)")
```



limma

```
228 ### Part 2
229 ## Load gse40279 and run analysis by using "limma" packages (from original code limma.R)
230 library(limma)
231 # Load modified GEOquery
232 library(GEOquery)
233 # Setting the max timeout_seconds
234 options(timeout=100000)
235 # Check the input timeout_seconds
236 getOption("timeout")
237 # Download GSE40279 by a fuction getGEO() from modified GEOquery package.
238 gse40279 <- getGEO("GSE40279", GSEMatrix = TRUE, AnnotGPL = TRUE) # if have not downloaded
239
240 gset <- gse40279
241 if (length(gset) > 1) idx <- grep("GPL13534", attr(gset, "names")) else idx <- 1
242 gset <- gset[[idx]]
```

```
244 # Create age categories
245 age <- pData(gset)$characteristics_ch1
246 # Remove "age (y):" and convert to numeric
247 age <- sub("^\\s*age \\\(y\\): ", "", age)
248 age <- as.numeric(age)
249 # Assign age values to a new column in pData of gset
250 pData(gset)$age <- age
251
252 # Define age categories based on specific age ranges
253 age_categories <- cut(age,
254                       breaks = c(0, 30, 65, Inf),
255                       labels = c("Young", "Middle", "old"),
256                       include.lowest = TRUE)
257
258 # Assign age categories to the pData of gset
259 pData(gset)$age_category <- age_categories
```

limma

```
261 ex <- exprs(gset)
262 # log2 transform
263 qx <- as.numeric(quantile(ex, c(0., 0.25, 0.5, 0.75, 0.99, 1.0), na.rm=T))
264 LogC <- (qx[5] > 100) ||
265   (qx[6]-qx[1] > 50 && qx[2] > 0)
266 if (LogC) { ex[which(ex <= 0)] <- NaN
267 ex <- log2(ex)}
```

修正limma design部分

```
269 conditions <- gset$age_category
270 f <- factor(conditions, levels = c("Young", "Middle", "old"))
271 design <- model.matrix(~0+f)
272 colnames(design) <- c("Young", "Middle", "old")
273 fit <- lmFit(gset, design)
274 contrast.matrix <- makeContrasts(Young-Middle, Young-Old, Middle-Old, levels=design)
275 fit2 <- contrasts.fit(fit, contrast.matrix)
276 fit2 <- eBayes(fit2)
277 |
278 result_limma_YM <- topTable(fit2, coef=1, number = Inf, adjust.method = "BH")
279 result_limma_YO <- topTable(fit2, coef=2, number = Inf, adjust.method = "BH")
280 result_limma_MO <- topTable(fit2, coef=3, number = Inf, adjust.method = "BH")
```

limma

all_for_gse40279.R ×

result_limma_YO ×

design ×

←

→

Filter

	Young	Middle	Old
1	0	0	1
2	0	0	1
3	0	0	1
4	0	1	0
5	0	1	0
6	0	0	1
7	0	0	1
8	0	0	1
9	0	0	1
10	0	0	1
11	0	0	1

Showing 1 to 12 of 656 entries, 3 total columns

limma

all_for_gse40279.R × result_limma_YO × design × contrast.matrix ×

← → Filter

	RANGE_START	RANGE_END	RANGE_GB	SPOT_ID	logFC	AveExpr	t	P.Value	adj.P.Val	B
	11044877	11045000	NC_000006.11		-0.24385647	0.66985810	-16.837418	4.015175e-53	1.899314e-47	109.99286
	106015767	106015890	NC_000002.11		-0.24140658	0.59460920	-14.225926	3.258140e-40	7.706054e-35	80.43733
	74820493	74820616	NC_000018.9		0.05948077	0.04427250	14.091892	1.402953e-39	2.212148e-34	78.98659
	106015739	106015862	NC_000002.11		-0.15680598	0.47413894	-13.543583	5.098771e-37	6.029730e-32	73.12963
	207997020	207997143	NC_000001.10		0.46085759	0.52823730	13.305195	6.356731e-36	6.013899e-31	70.62373
	66389420	66389543	NC_000018.9		0.22818140	0.22135833	13.020478	1.251733e-34	9.868537e-30	67.66442
	31775895	31776018	NC_000015.9		-0.25500753	0.29714165	-12.549059	1.601598e-32	1.082300e-27	62.84822
	18122719	18122842	NC_000006.11		-0.10806639	0.31303571	-12.046219	2.513100e-30	1.485977e-25	57.83166
	11044894	11045017	NC_000006.11		-0.11216532	0.43868092	-12.015378	3.412476e-30	1.793575e-25	57.52819
	106015771	106015894	NC_000002.11		-0.17292556	0.40706023	-11.831352	2.095991e-29	9.914750e-25	55.72774
	151298954	151299077	NC_000001.10		0.08833130	0.20903326	11.656835	1.153001e-28	4.773085e-24	54.03696

Showing 1 to 11 of 473,034 entries, 43 total columns

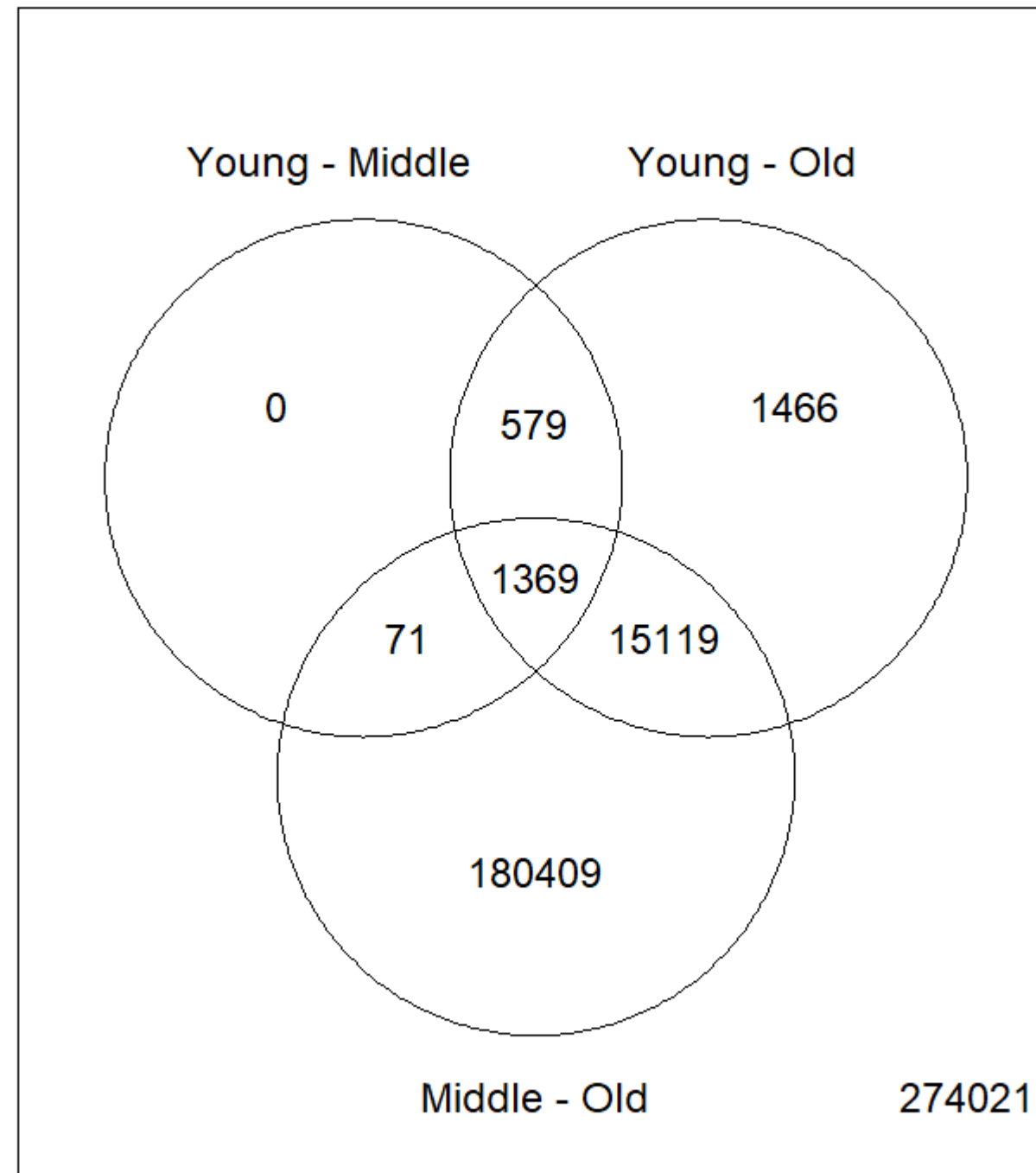
limma

```
282 # Outcome of each hypothesis test
283 results <- decideTests(fit2)
284
285 # Showing numbers of genes significant in each comparison
286 vennDiagram(results)
```

```
> results
TestResults matrix
      Contrasts
      Young - Middle Young - old Middle - old
cg000000029         0         1         1
cg000000108         0         0         0
cg000000109         0         0         0
cg000000165         0         0         0
cg000000236         0         0         0
473029 more rows ...
```

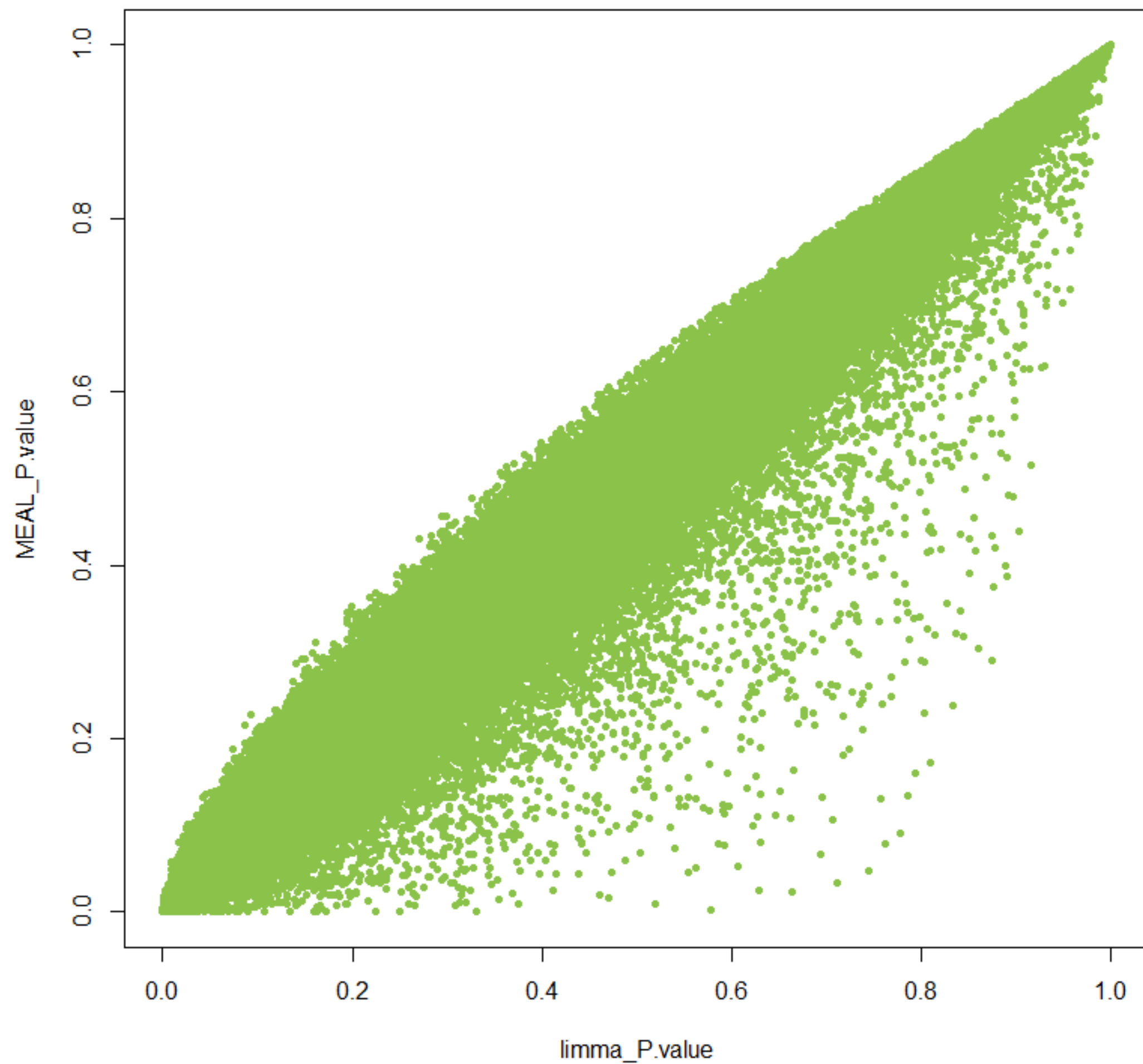
number of significant genes by limma

```
282 # Outcome of each hypothesis test
283 results <- decideTests(fit2)
284
285 # Showing numbers of genes significant in each comparison
286 vennDiagram(results)
```

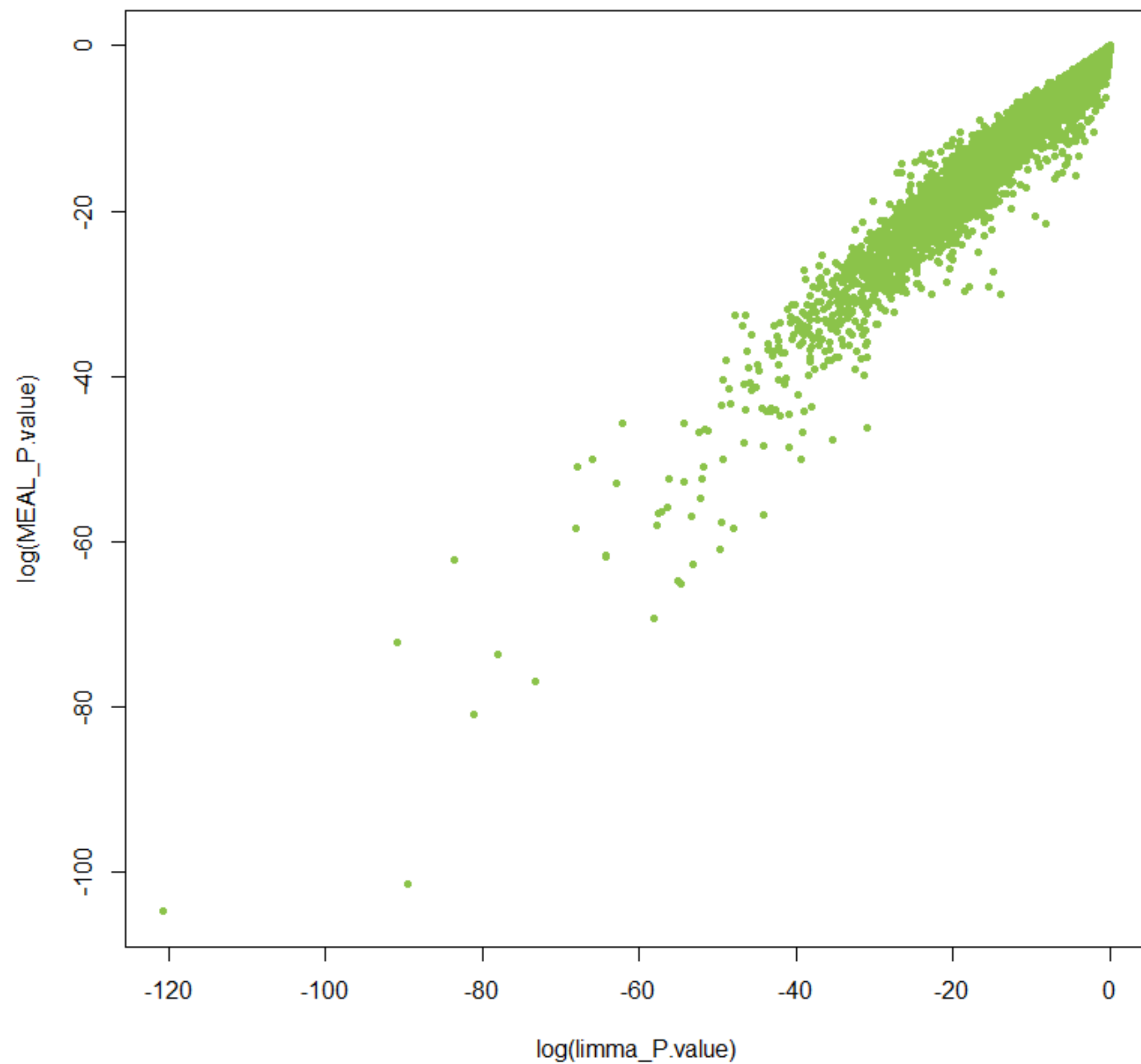


```
292 ### Part 3
293 ## Merge the results of analysis from MEAL and limma, and then create a scatter plot (from original code 6.R)
294 library(ggplot2)
295
296 # Merge results
297 res_limma_YO_c_p <- data.frame(name = row.names(result_limma_YO), limma_p = result_limma_YO$P.Value)
298 res_MEAL_YO_c_p <- data.frame(name = row.names(result_Meal_sub_YO_clean), MEAL_p = result_Meal_sub_YO_clean$P.Value)
299
300 limma_Meal_YO_p <- merge(res_limma_YO_c_p,
301                          res_MEAL_YO_c_p,
302                          by.x = "name",
303                          by.y = "name")
304
305 # Create a scatter plot with x-axis: p-value from limma and y-axis: p-value from MEAL.
306 plot(limma_Meal_YO_p$limma_p, limma_Meal_YO_p$MEAL_p,
307      xlab = "limma_P.value", ylab = "MEAL_P.value",
308      main = "P.value from Analysis of DiffMean (Young - Old) on MEAL and limma",
309      pch = 20, col = "#8bc34a", cex = 1)
```

P.value from Analysis of DiffMean (Young - Old) on MEAL and limma



P.value from Analysis of DiffMean (Young - Old) on MEAL and limma



P.value from Analysis of DiffMean (Young - Old) on MEAL and limma

