

## BoolNet Inference (E-GEOD-18494)

Expression profiling of hypoxic HepG2 hepatoma, U87 glioma, and MDA-MB231 breast cancer cells: time course (E-GEOD-18494)

Analysis of expression changes of cultured HepG2 hepatoma, U87 glioma, and MDA-MB231 breast cancer cells subjected to hypoxia (0.5% O<sub>2</sub>) for 0, 4, 8, 12 hours . Results provide insight to cell type-specific response to hypoxia. HepG2 hepatoma, U87 glioma, and MDA-MB231 breast cancer cells were collected under normoxic conditions (~19% O<sub>2</sub>, 0 hours) and after 4, 8 and 12 hours of hypoxia treatment (0.5% O<sub>2</sub>). For each cell line, three replicates of total RNA at each time point were prepared using Trizol and submitted to the DFCI Microarray Core for labeling, hybridization to Affymetrix HG-U133Plus2 oligonucleotide arrays and image scanning.

<https://www.ebi.ac.uk/arrayexpress/experiments/E-GEOD-18494/>

```
packages_cran = c("igraph", "BoolNet", "BiocManager", "tidyverse", "fs")

# Install and load packages
package.check <- lapply(packages_cran, FUN = function(x) {
  if (!require(x, character.only = TRUE)) {
    install.packages(x, dependencies = TRUE)
    library(x, character.only = TRUE)
  }
})

library(RSQLite, lib.loc = "/usr/local/lib/R/site-library")

# For oligo and ArrayExpress First install:
#install.packages('https://cran.r-project.org/src/contrib/Archive/ff/ff_2.2-14.tar.gz', repos=NULL)

packages_bioconductor = c("Biobase", "GEOquery", "ArrayExpress", "hgu133plus2.db", "preprocessCore")

# Install and load packages
package.check <- lapply(packages_bioconductor, FUN = function(x) {
  if (!require(x, character.only = TRUE)) {
    BiocManager::install(x, dependencies = TRUE)
    library(x, character.only = TRUE)
  }
})

rm(package.check, packages_bioconductor, packages_cran)

download_dir <- fs::path(".data_tmp")
if (!dir_exists(download_dir)) {
  dir_create(download_dir)
  EGEOD18494 <- ArrayExpress( "E-GEOD-18494", save=TRUE, path=download_dir)
} else {
```

```
EGEOD18494 <- ArrayExpress( "E-GEOD-18494", save=TRUE, path=download_dir)
}
```

```
## Reading in : .data_tmp/GSM460679.CEL
## Reading in : .data_tmp/GSM460699.CEL
## Reading in : .data_tmp/GSM460681.CEL
## Reading in : .data_tmp/GSM460685.CEL
## Reading in : .data_tmp/GSM460700.CEL
## Reading in : .data_tmp/GSM460675.CEL
## Reading in : .data_tmp/GSM460695.CEL
## Reading in : .data_tmp/GSM460686.CEL
## Reading in : .data_tmp/GSM460677.CEL
## Reading in : .data_tmp/GSM460698.CEL
## Reading in : .data_tmp/GSM460678.CEL
## Reading in : .data_tmp/GSM460696.CEL
## Reading in : .data_tmp/GSM460697.CEL
## Reading in : .data_tmp/GSM460693.CEL
## Reading in : .data_tmp/GSM460692.CEL
## Reading in : .data_tmp/GSM460683.CEL
## Reading in : .data_tmp/GSM460676.CEL
## Reading in : .data_tmp/GSM460673.CEL
## Reading in : .data_tmp/GSM460690.CEL
## Reading in : .data_tmp/GSM460684.CEL
## Reading in : .data_tmp/GSM460688.CEL
## Reading in : .data_tmp/GSM460687.CEL
## Reading in : .data_tmp/GSM460669.CEL
## Reading in : .data_tmp/GSM460682.CEL
## Reading in : .data_tmp/GSM460671.CEL
## Reading in : .data_tmp/GSM460702.CEL
## Reading in : .data_tmp/GSM460701.CEL
## Reading in : .data_tmp/GSM460674.CEL
## Reading in : .data_tmp/GSM460691.CEL
## Reading in : .data_tmp/GSM460704.CEL
## Reading in : .data_tmp/GSM460680.CEL
## Reading in : .data_tmp/GSM460670.CEL
## Reading in : .data_tmp/GSM460694.CEL
## Reading in : .data_tmp/GSM460672.CEL
## Reading in : .data_tmp/GSM460703.CEL
## Reading in : .data_tmp/GSM460689.CEL
```

```
data.EGEOD18494 <- Biobase::pData(EGEOD18494)
```

```
data.EGEOD18494 <- data.frame(
  codes = substr(data.EGEOD18494$Source.Name,1,9),
  cell_line = data.EGEOD18494$Characteristics..cell.line.,
  time = data.EGEOD18494$Characteristics..time,
  condition = data.EGEOD18494$Characteristics..stress.
)
```

```
data.EGEOD18494 <- data.EGEOD18494[order(data.EGEOD18494$codes),]
data.EGEOD18494$rep <- rep(1:3, n= length(data.EGEOD18494$codes))
```

```
# Normalisation
```

```
eset.EGEOD18494 <- oligo::rma(EGEOD18494, normalize = TRUE)
```

```
## Background correcting
## Normalizing
## Calculating Expression
```

```
exp.EGEO18494 <- exprs(eset.EGEO18494)

colnames(exp.EGEO18494) <- substr(colnames(exp.EGEO18494),1,9)

EGEO18494@annotation
```

```
## [1] "pd.hg.u133.plus.2"
```

```
rm(download_dir)
```

## Convert the probes to Symbol names

```
anno.EGEO18494 <- AnnotationDbi::select(hgu133plus2.db, keys=rownames(exp.EGEO18494), columns=c("ENSEMBL", "SYMBOL", "DESCRIPTION"))
```

```
## 'select()' returned 1:many mapping between keys and columns
```

```
colnames(anno.EGEO18494) <- c("probes", "ensgene", "symbol", "description")
```

## Selecting the HIF Genes

```
# Selecting genes from HIF Axis
hif.symbols <- c("TP53", "HIF1A", "EP300", "MDM2", "VHL")

hif.probes <- anno.EGEO18494$probes[anno.EGEO18494$symbol %in% hif.symbols]

# Select the probes and genes
exp.EGEO18494.hif <- as.data.frame(exp.EGEO18494) %>%
  rownames_to_column('probes') %>%
  filter(probes %in% hif.probes) %>%
  merge(anno.EGEO18494[anno.EGEO18494$symbol %in% hif.symbols, c("probes","symbol")], by = "probes") %>%
  #distinct(symbol, .keep_all = TRUE) %>% # Take the first one
  dplyr::select(!(probes))

# Function to binarize according an consensus mean of probes, add the O2 state and rename columns
binNet <- function(b){
  binarizeTimeSeries(b[, -5], method="kmeans")$binarizedMeasurements %>%
  as.data.frame(.) %>%
  aggregate(., list(symbol = b$symbol), mean) %>%
  mutate_at(vars(-symbol), funs(ifelse(. > 0.4, 1, 0))) %>%
  rbind(., c("O2", 1,0,0,0)) %>%
  rename_at(vars(data.EGEO18494$codes[data.EGEO18494$codes %in% names(b)] ),
```

```

~paste0(substr(data.EGEOD18494$condition[data.EGEOD18494$codes %in% names(b)],1,4),".",
data.EGEOD18494$time[data.EGEOD18494$codes %in% names(b)],".",
substr(data.EGEOD18494$cell_line[data.EGEOD18494$codes %in% names(b)],1,1),".",
data.EGEOD18494$rep[data.EGEOD18494$codes %in% names(b)]) %>%
column_to_rownames("symbol")
}

```

## Exemplifying the Binarization

```

breast1x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "MDA-MB231 breast cancer" &
data.EGEOD18494$rep == 1], "symbol")) %>% arrange(symbol)

names(breast1x) <- c("norm.control.M.1", "hypo.4h.M.1", "hypo.8h.M.1", "hypo.12h.M.1", "symbol")

breast1x[, c("symbol", "norm.control.M.1", "hypo.4h.M.1", "hypo.8h.M.1", "hypo.12h.M.1")]

```

##	symbol	norm.control.M.1	hypo.4h.M.1	hypo.8h.M.1	hypo.12h.M.1
## 1	EP300	7.117723	7.444650	7.564863	7.102371
## 2	EP300	7.413672	7.507501	7.570583	7.374402
## 3	HIF1A	12.201881	11.633014	10.456373	10.119609
## 4	MDM2	5.524042	5.320023	5.350573	5.446186
## 5	MDM2	4.045154	3.853332	4.078569	4.257243
## 6	MDM2	5.078994	4.927372	5.029658	4.981994
## 7	MDM2	6.355831	6.328876	6.389927	6.806724
## 8	MDM2	4.287158	4.755383	4.670058	4.462138
## 9	MDM2	8.162994	8.179121	8.219938	8.085525
## 10	MDM2	7.285900	7.207761	7.123573	6.955918
## 11	MDM2	3.623543	3.829355	3.753720	4.100483
## 12	MDM2	4.054654	4.129631	4.067410	4.256327
## 13	MDM2	8.207312	7.778604	7.656600	7.797764
## 14	TP53	8.895355	8.773830	9.104009	9.136858
## 15	TP53	8.600345	8.240598	8.641253	8.664151
## 16	VHL	7.698038	7.713089	7.348580	7.098092
## 17	VHL	3.738962	3.749649	3.759698	3.638137

```

binarizeTimeSeries(breast1x[,-5], method="kmeans")$binarizedMeasurements %>%
  as.data.frame(.) %>%
  add_column(symbol = breast1x$symbol) %>% dplyr::select( c("symbol", "norm.control.M.1", "hypo.4h.M.1", "hypo.8h.M.1", "hypo.12h.M.1")

```

##	symbol	norm.control.M.1	hypo.4h.M.1	hypo.8h.M.1	hypo.12h.M.1
## 1	EP300	0	1	1	0
## 2	EP300	0	1	1	0
## 3	HIF1A	1	1	0	0
## 4	MDM2	1	0	0	1
## 5	MDM2	1	0	1	1
## 6	MDM2	1	0	1	0
## 7	MDM2	0	0	0	1
## 8	MDM2	0	1	1	0

```
## 9      MDM2                1          1          1          0
## 10     MDM2                1          1          1          0
## 11     MDM2                0          0          0          1
## 12     MDM2                0          0          0          1
## 13     MDM2                1          0          0          0
## 14     TP53                0          0          1          1
## 15     TP53                1          0          1          1
## 16      VHL                1          1          0          0
## 17      VHL                1          1          1          0
```

```
binarizeTimeSeries(breast1x[,-5], method="kmeans")$binarizedMeasurements %>%
  as.data.frame(.) %>%
  aggregate(., list(symbol = breast1x$symbol), mean) %>%
  mutate_at(vars(-symbol), funs(ifelse(. > 0.4, 1, 0))) %>%
  rbind(., c("O2", 1,0,0,0))
```

```
## Warning: `funs()` is deprecated as of dplyr 0.8.0.
## Please use a list of either functions or lambdas:
##
##   # Simple named list:
##   list(mean = mean, median = median)
##
##   # Auto named with `tibble::lst()`:
##   tibble::lst(mean, median)
##
##   # Using lambdas
##   list(~ mean(., trim = .2), ~ median(., na.rm = TRUE))
## This warning is displayed once every 8 hours.
## Call `lifecycle::last_warnings()` to see where this warning was generated.
```

```
##      symbol norm.control.M.1 hypo.4h.M.1 hypo.8h.M.1 hypo.12h.M.1
## 1   EP300                0          1          1          0
## 2   HIF1A                1          1          0          0
## 3    MDM2                1          0          1          1
## 4    TP53                1          0          1          1
## 5     VHL                1          1          1          0
## 6      O2                1          0          0          0
```

## MDA-MB231 breast cancer

```
breast1x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "MDA-MB231 breast cancer" &
    data.EGEOD18494$rep == 1], "symbol")) %>%
  binNet(.)
breast1x
```

```
##      norm.control.M.1 hypo.4h.M.1 hypo.8h.M.1 hypo.12h.M.1
## EP300                0          1          1          0
## HIF1A                1          1          0          0
```

## MDM2	1	0	1	1
## TP53	1	0	1	1
## VHL	1	1	1	0
## O2	1	0	0	0

```
breast2x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "MDA-MB231 breast cancer" &
    data.EGEOD18494$rep == 2], "symbol")) %>%
  binNet(.)
breast2x
```

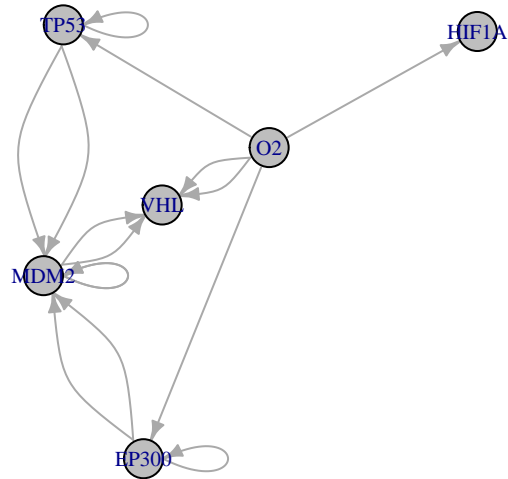
##	norm.control.M.2	hypo.4h.M.2	hypo.8h.M.2	hypo.12h.M.2
## EP300	1	0	1	1
## HIF1A	1	1	0	0
## MDM2	1	0	1	0
## TP53	0	1	1	1
## VHL	1	1	1	0
## O2	1	0	0	0

```
breast3x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "MDA-MB231 breast cancer" &
    data.EGEOD18494$rep == 3], "symbol")) %>%
  binNet(.)
breast3x
```

##	norm.control.M.3	hypo.4h.M.3	hypo.8h.M.3	hypo.12h.M.3
## EP300	0	1	1	1
## HIF1A	1	1	0	0
## MDM2	1	1	0	1
## TP53	0	1	1	1
## VHL	1	1	0	1
## O2	1	0	0	0

*# All breast cancer nets merged:*

```
net <- reconstructNetwork(list(breast1x, breast2x, breast3x), method="bestfit",returnPBN=TRUE,readableF
plotNetworkWiring(net)
```



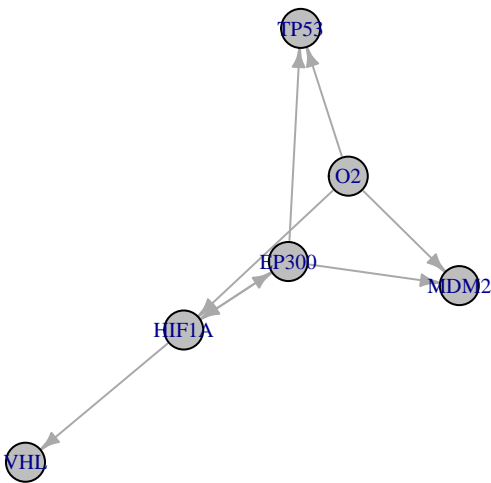
```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (!O2) | (!EP300) ( probability: 1, error: 1)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (O2) ( probability: 1, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!MDM2 & TP53) | (!EP300 & MDM2 & !TP53) | (EP300 & !MDM2) ( probability: 0.5, error: 1)
## MDM2 = (!MDM2) | (!EP300 & !TP53) ( probability: 0.5, error: 1)
##
## Alternative transition functions for gene TP53:
## TP53 = (!O2) | (!TP53) ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (!MDM2 & !O2) | (MDM2 & O2) ( probability: 0.5, error: 0)
## VHL = (!MDM2) | (O2) ( probability: 0.5, error: 0)
```

```
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## O2 = 0
```

```
# Individual nets of each replica:
```

```
net <- reconstructNetwork(breast1x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)
```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
```

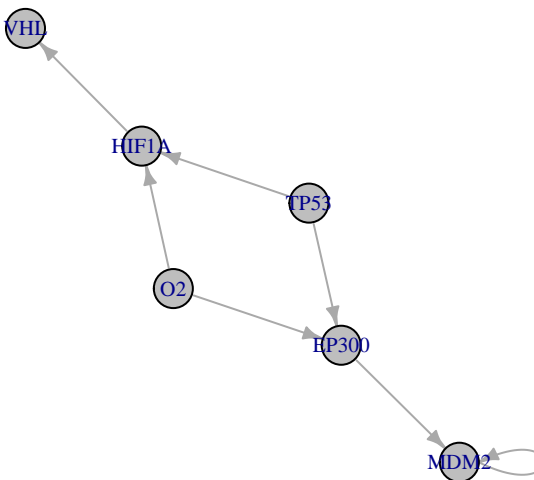


```

## HIF1A = (O2) ( probability: 0.5, error: 0)
## HIF1A = (!EP300) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!O2) ( probability: 0.5, error: 0)
## MDM2 = (EP300) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = (!O2) ( probability: 0.5, error: 0)
## TP53 = (EP300) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## O2 = 0

net <- reconstructNetwork(breast2x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)

```



```
print(net)
```

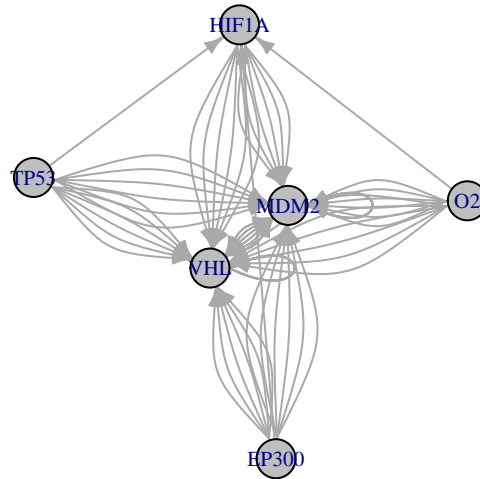
```
## Probabilistic Boolean network with 6 genes
```

```

##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (!O2) ( probability: 0.5, error: 0)
## EP300 = (TP53) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (O2) ( probability: 0.5, error: 0)
## HIF1A = (!TP53) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!MDM2) ( probability: 0.5, error: 0)
## MDM2 = (!EP300) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## TP53 = 1
## O2 = 0

net <- reconstructNetwork(breast3x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)

```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (O2) ( probability: 0.3333333, error: 0)
## HIF1A = (!TP53) ( probability: 0.3333333, error: 0)
## HIF1A = (!EP300) ( probability: 0.3333333, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!VHL & !O2) | (VHL & O2) ( probability: 0.05555556, error: 0)
## MDM2 = (!VHL) | (O2) ( probability: 0.05555556, error: 0)
## MDM2 = (!TP53 & VHL) | (TP53 & !VHL) ( probability: 0.05555556, error: 0)
## MDM2 = (!VHL) | (!TP53) ( probability: 0.05555556, error: 0)
## MDM2 = (!MDM2 & !O2) | (MDM2 & O2) ( probability: 0.05555556, error: 0)
## MDM2 = (!MDM2) | (O2) ( probability: 0.05555556, error: 0)
## MDM2 = (!MDM2 & TP53) | (MDM2 & !TP53) ( probability: 0.05555556, error: 0)
```

```

## MDM2 = (!TP53) | (!MDM2) ( probability: 0.05555556, error: 0)
## MDM2 = (!HIF1A & !O2) | (HIF1A & O2) ( probability: 0.05555556, error: 0)
## MDM2 = (!HIF1A) | (O2) ( probability: 0.05555556, error: 0)
## MDM2 = (!HIF1A & TP53) | (HIF1A & !TP53) ( probability: 0.05555556, error: 0)
## MDM2 = (!TP53) | (!HIF1A) ( probability: 0.05555556, error: 0)
## MDM2 = (!EP300 & VHL) | (EP300 & !VHL) ( probability: 0.05555556, error: 0)
## MDM2 = (!VHL) | (!EP300) ( probability: 0.05555556, error: 0)
## MDM2 = (!EP300 & MDM2) | (EP300 & !MDM2) ( probability: 0.05555556, error: 0)
## MDM2 = (!MDM2) | (!EP300) ( probability: 0.05555556, error: 0)
## MDM2 = (!EP300 & HIF1A) | (EP300 & !HIF1A) ( probability: 0.05555556, error: 0)
## MDM2 = (!HIF1A) | (!EP300) ( probability: 0.05555556, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (!VHL & !O2) | (VHL & O2) ( probability: 0.05555556, error: 0)
## VHL = (!VHL) | (O2) ( probability: 0.05555556, error: 0)
## VHL = (!TP53 & VHL) | (TP53 & !VHL) ( probability: 0.05555556, error: 0)
## VHL = (!VHL) | (!TP53) ( probability: 0.05555556, error: 0)
## VHL = (!MDM2 & !O2) | (MDM2 & O2) ( probability: 0.05555556, error: 0)
## VHL = (!MDM2) | (O2) ( probability: 0.05555556, error: 0)
## VHL = (!MDM2 & TP53) | (MDM2 & !TP53) ( probability: 0.05555556, error: 0)
## VHL = (!TP53) | (!MDM2) ( probability: 0.05555556, error: 0)
## VHL = (!HIF1A & !O2) | (HIF1A & O2) ( probability: 0.05555556, error: 0)
## VHL = (!HIF1A) | (O2) ( probability: 0.05555556, error: 0)
## VHL = (!HIF1A & TP53) | (HIF1A & !TP53) ( probability: 0.05555556, error: 0)
## VHL = (!TP53) | (!HIF1A) ( probability: 0.05555556, error: 0)
## VHL = (!EP300 & VHL) | (EP300 & !VHL) ( probability: 0.05555556, error: 0)
## VHL = (!VHL) | (!EP300) ( probability: 0.05555556, error: 0)
## VHL = (!EP300 & MDM2) | (EP300 & !MDM2) ( probability: 0.05555556, error: 0)
## VHL = (!MDM2) | (!EP300) ( probability: 0.05555556, error: 0)
## VHL = (!EP300 & HIF1A) | (EP300 & !HIF1A) ( probability: 0.05555556, error: 0)
## VHL = (!HIF1A) | (!EP300) ( probability: 0.05555556, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## EP300 = 1
## TP53 = 1
## O2 = 0

```

## HepG2 hepatoma

```

hepatoma1x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "HepG2 hepatoma" &
    data.EGEOD18494$rep == 1], "symbol")) %>%
  binNet(.)
hepatoma1x

```

	norm.control.H.1	hypo.4h.H.1	hypo.8h.H.1	hypo.12h.H.1
## EP300	1	1	0	0
## HIF1A	0	0	1	0
## MDM2	1	1	0	1
## TP53	1	1	0	1
## VHL	1	0	1	0
## O2	1	0	0	0

```

hepatoma2x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "HepG2 hepatoma" &
    data.EGEOD18494$rep == 2], "symbol")) %>%
  binNet(.)
hepatoma2x

```

	norm.control.H.2	hypo.4h.H.2	hypo.8h.H.2	hypo.12h.H.2
## EP300	0	1	1	1
## HIF1A	0	0	1	0
## MDM2	0	1	1	1
## TP53	0	1	1	0
## VHL	1	0	1	1
## O2	1	0	0	0

```

hepatoma3x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "HepG2 hepatoma" &
    data.EGEOD18494$rep == 3], "symbol")) %>%
  binNet(.)
hepatoma3x

```

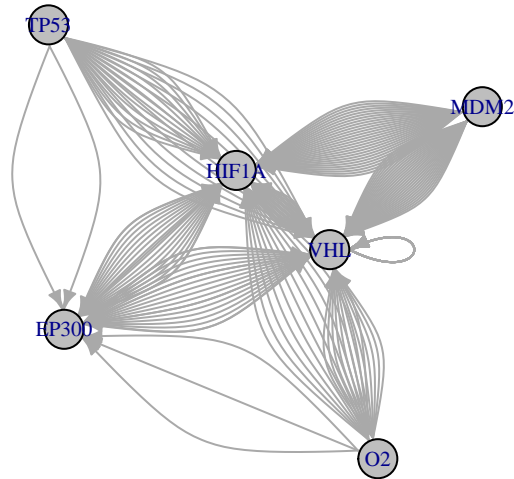
	norm.control.H.3	hypo.4h.H.3	hypo.8h.H.3	hypo.12h.H.3
## EP300	1	1	0	1
## HIF1A	0	1	1	0
## MDM2	0	1	0	1
## TP53	1	1	1	1
## VHL	1	1	0	0
## O2	1	0	0	0

*# All nets hepatoma merged:*

```

net <- reconstructNetwork(list(hepatoma1x, hepatoma2x, hepatoma3x), method="bestfit", returnPBN=TRUE, readData=TRUE)
plotNetworkWiring(net)

```



```
print(net)
```

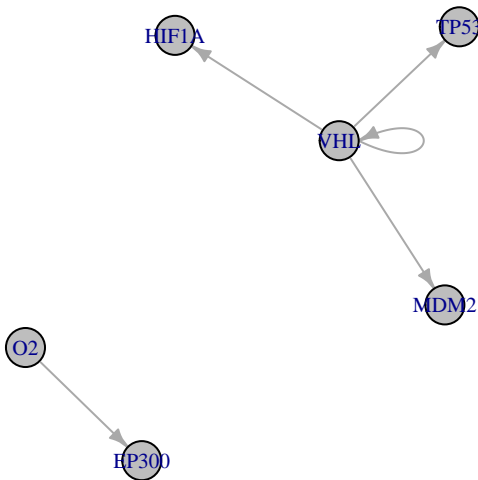
```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (!VHL & !O2) | (VHL & O2) ( probability: 0.1666667, error: 2)
## EP300 = (!VHL) | (O2) ( probability: 0.1666667, error: 2)
## EP300 = (O2) | (TP53) ( probability: 0.1666667, error: 2)
## EP300 = (!HIF1A & VHL) | (HIF1A & !VHL) ( probability: 0.1666667, error: 2)
## EP300 = (!VHL) | (!HIF1A) ( probability: 0.1666667, error: 2)
## EP300 = (!HIF1A) | (TP53) ( probability: 0.1666667, error: 2)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (!MDM2 & TP53 & O2) | (MDM2 & TP53 & !O2) ( probability: 0.03571429, error: 1)
## HIF1A = (!MDM2 & TP53 & O2) | (MDM2 & !TP53 & O2) | (MDM2 & TP53 & !O2) ( probability: 0.03571429, error: 1)
## HIF1A = (!MDM2 & TP53 & O2) | (MDM2 & !O2) ( probability: 0.03571429, error: 1)
## HIF1A = (!MDM2 & TP53 & O2) | (MDM2 & !O2) | (MDM2 & !TP53) ( probability: 0.03571429, error: 1)
## HIF1A = (!MDM2 & TP53 & VHL) | (MDM2 & TP53 & !VHL) ( probability: 0.03571429, error: 1)
## HIF1A = (!MDM2 & TP53 & VHL) | (MDM2 & !TP53 & VHL) | (MDM2 & TP53 & !VHL) ( probability: 0.03571429, error: 1)
## HIF1A = (!MDM2 & TP53 & VHL) | (MDM2 & !VHL) ( probability: 0.03571429, error: 1)
```



```
## VHL = (MDM2 & !VHL) | (EP300 & !VHL) | (EP300 & !MDM2) ( probability: 0.03571429, error: 1)
## VHL = (MDM2 & !VHL) | (!EP300 & MDM2) | (EP300 & !MDM2 & VHL) ( probability: 0.03571429, error: 1)
## VHL = (MDM2 & !VHL) | (!EP300 & MDM2) | (EP300 & !VHL) | (EP300 & !MDM2) ( probability: 0.03571429, error: 1)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## MDM2 = 1
## TP53 = 1
## O2 = 0
```

```
# Individual nets of each replica:
```

```
net <- reconstructNetwork(hepatoma1x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)
```



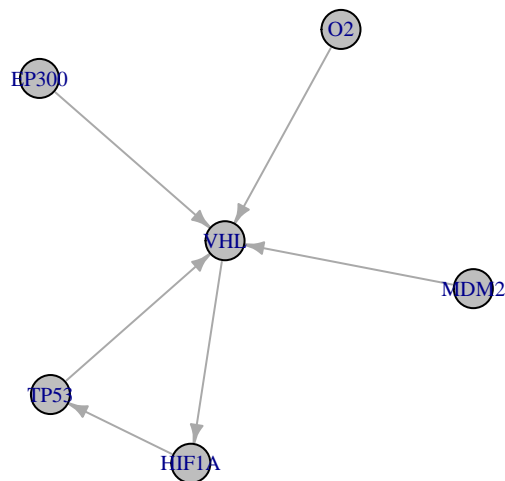
```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
```



```
##
## Alternative transition functions for gene EP300:
## EP300 = (O2) ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (!VHL) ( probability: 1, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (VHL) ( probability: 1, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = (VHL) ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (!VHL) ( probability: 1, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## O2 = 0

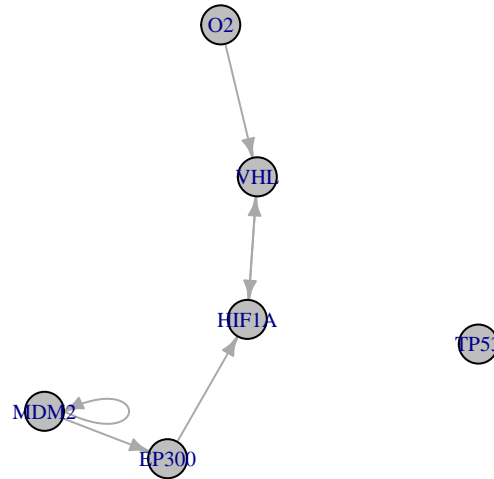
net <- reconstructNetwork(hepatoma2x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)
```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (!VHL) ( probability: 1, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = (!HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (!O2) ( probability: 0.25, error: 0)
## VHL = (TP53) ( probability: 0.25, error: 0)
## VHL = (MDM2) ( probability: 0.25, error: 0)
## VHL = (EP300) ( probability: 0.25, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## EP300 = 1
## MDM2 = 1
## O2 = 0
```

```
net <- reconstructNetwork(hepatoma3x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)
```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (!MDM2) ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (VHL) ( probability: 0.5, error: 0)
## HIF1A = (EP300) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!MDM2) ( probability: 1, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (O2) ( probability: 0.5, error: 0)
## VHL = (!HIF1A) ( probability: 0.5, error: 0)
```

```
##
## Alternative transition functions for gene 02:
## 02 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## TP53 = 1
## 02 = 0
```

## U87 glioma

```
glioma1x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "U87 glioma" &
    data.EGEOD18494$rep == 1], "symbol")) %>%
  binNet(.)
glioma1x
```

```
##      norm.control.U.1 hypo.4h.U.1 hypo.8h.U.1 hypo.12h.U.1
## EP300                1            0            0            1
## HIF1A                1            0            0            0
## MDM2                 1            0            0            0
## TP53                 1            0            1            1
## VHL                  1            1            0            1
## 02                   1            0            0            0
```

```
glioma2x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "U87 glioma" &
    data.EGEOD18494$rep == 2], "symbol")) %>%
  binNet(.)
glioma2x
```

```
##      norm.control.U.2 hypo.4h.U.2 hypo.8h.U.2 hypo.12h.U.2
## EP300                1            0            1            0
## HIF1A                1            1            0            0
## MDM2                 0            0            0            1
## TP53                 1            0            1            0
## VHL                  0            1            1            0
## 02                   1            0            0            0
```

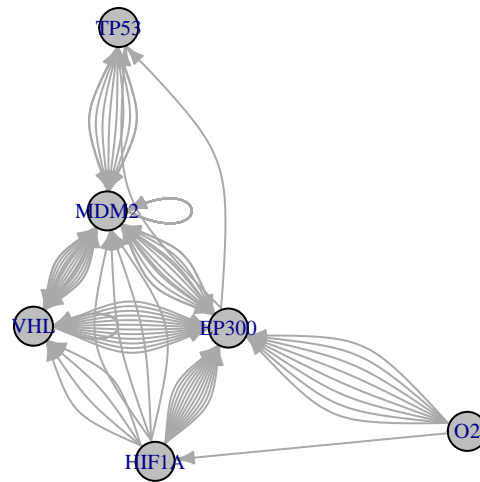
```
glioma3x <-
exp.EGEOD18494.hif %>%
  dplyr::select(c(data.EGEOD18494$codes[data.EGEOD18494$cell_line == "U87 glioma" &
    data.EGEOD18494$rep == 3], "symbol")) %>%
  binNet(.)
glioma3x
```

```
##      norm.control.U.3 hypo.4h.U.3 hypo.8h.U.3 hypo.12h.U.3
## EP300                1            1            1            0
```

```
## HIF1A      1      1      0      0
## MDM2       1      1      1      0
## TP53       1      1      1      1
## VHL        1      0      1      1
## O2         1      0      0      0
```

```
# All glioma nets merged:
```

```
net <- reconstructNetwork(list(glioma1x, glioma2x, glioma3x), method="bestfit",returnPBN=TRUE,readableF
plotNetworkWiring(net)
```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
```

```
##
```

```
## Involved genes:
```

```
## EP300 HIF1A MDM2 TP53 VHL O2
```

```
##
```

```
## Transition functions:
```

```
##
```

```
## Alternative transition functions for gene EP300:
```

```
## EP300 = (!VHL & !O2) | (HIF1A & !O2) ( probability: 0.08333333, error: 1)
```

```
## EP300 = (!VHL & !O2) | (HIF1A & !O2) | (HIF1A & VHL) ( probability: 0.08333333, error: 1)
```

```
## EP300 = (!VHL & !O2) | (!HIF1A & VHL & O2) | (HIF1A & !O2) ( probability: 0.08333333, error: 1)
```

```
## EP300 = (!VHL & !O2) | (VHL & O2) | (HIF1A & !O2) ( probability: 0.08333333, error: 1)
```

```

## EP300 = (!VHL & !O2) | (!HIF1A & !VHL) | (HIF1A & !O2) ( probability: 0.08333333, error: 1)
## EP300 = (!VHL & !O2) | (!HIF1A & !VHL) | (HIF1A & !O2) | (HIF1A & VHL) ( probability: 0.08333333, error: 1)
## EP300 = (!VHL & !O2) | (!HIF1A & O2) | (HIF1A & !O2) ( probability: 0.08333333, error: 1)
## EP300 = (!VHL & !O2) | (!HIF1A & O2) | (HIF1A & !O2) | (VHL & O2) ( probability: 0.08333333, error: 1)
## EP300 = (!HIF1A & !MDM2 & !VHL) | (HIF1A & !MDM2 & VHL) | (HIF1A & MDM2 & !VHL) ( probability: 0.08333333, error: 1)
## EP300 = (!HIF1A & !MDM2 & !VHL) | (HIF1A & VHL) | (HIF1A & MDM2) ( probability: 0.08333333, error: 1)
## EP300 = (!HIF1A & !VHL) | (HIF1A & !MDM2 & VHL) | (MDM2 & !VHL) ( probability: 0.08333333, error: 1)
## EP300 = (!HIF1A & !VHL) | (HIF1A & VHL) | (MDM2 & !VHL) ( probability: 0.08333333, error: 1)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (O2) ( probability: 1, error: 1)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!MDM2 & TP53 & VHL) | (MDM2 & TP53 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!MDM2 & TP53 & VHL) | (MDM2 & !TP53 & VHL) | (MDM2 & TP53 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!MDM2 & TP53 & VHL) | (MDM2 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!MDM2 & TP53 & VHL) | (MDM2 & !VHL) | (MDM2 & !TP53) ( probability: 0.0625, error: 1)
## MDM2 = (!MDM2 & !TP53 & !VHL) | (!MDM2 & TP53 & VHL) | (MDM2 & TP53 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!MDM2 & !TP53 & !VHL) | (!MDM2 & TP53 & VHL) | (MDM2 & !TP53 & VHL) | (MDM2 & TP53 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!TP53 & !VHL) | (!MDM2 & TP53 & VHL) | (MDM2 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!TP53 & !VHL) | (!MDM2 & TP53 & VHL) | (MDM2 & !TP53) | (MDM2 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (EP300 & !MDM2 & VHL) | (EP300 & MDM2 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (!EP300 & MDM2 & VHL) | (EP300 & !MDM2 & VHL) | (EP300 & MDM2 & !VHL) ( probability: 0.0625, error: 1)
## MDM2 = (MDM2 & !VHL) | (EP300 & !MDM2 & VHL) ( probability: 0.0625, error: 1)
## MDM2 = (MDM2 & !VHL) | (!EP300 & MDM2) | (EP300 & !MDM2 & VHL) ( probability: 0.0625, error: 1)
## MDM2 = (EP300 & !HIF1A & !MDM2) | (EP300 & HIF1A & MDM2) ( probability: 0.0625, error: 1)
## MDM2 = (HIF1A & MDM2) | (EP300 & !HIF1A & !MDM2) ( probability: 0.0625, error: 1)
## MDM2 = (!EP300 & !HIF1A & MDM2) | (EP300 & !HIF1A & !MDM2) | (EP300 & HIF1A & MDM2) ( probability: 0.0625, error: 1)
## MDM2 = (!EP300 & MDM2) | (EP300 & !HIF1A & !MDM2) | (HIF1A & MDM2) ( probability: 0.0625, error: 1)
##
## Alternative transition functions for gene TP53:
## TP53 = (!EP300 & !MDM2) | (EP300 & MDM2) ( probability: 0.5, error: 1)
## TP53 = (!EP300) | (MDM2) ( probability: 0.5, error: 1)
##
## Alternative transition functions for gene VHL:
## VHL = (!MDM2 & !VHL) | (!HIF1A & MDM2 & VHL) | (HIF1A & !MDM2) | (HIF1A & !VHL) ( probability: 0.25, error: 1)
## VHL = (!MDM2 & !VHL) | (MDM2 & VHL) | (HIF1A) ( probability: 0.25, error: 1)
## VHL = (!VHL) | (!HIF1A & MDM2) | (HIF1A & !MDM2) ( probability: 0.25, error: 1)
## VHL = (!VHL) | (MDM2) | (HIF1A) ( probability: 0.25, error: 1)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## O2 = 0

```

```

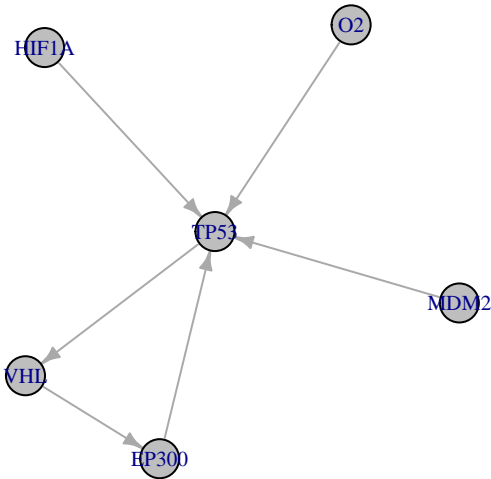
# Individual nets of each replica:

```

```

net <- reconstructNetwork(glioma1x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)

```



```
print(net)
```

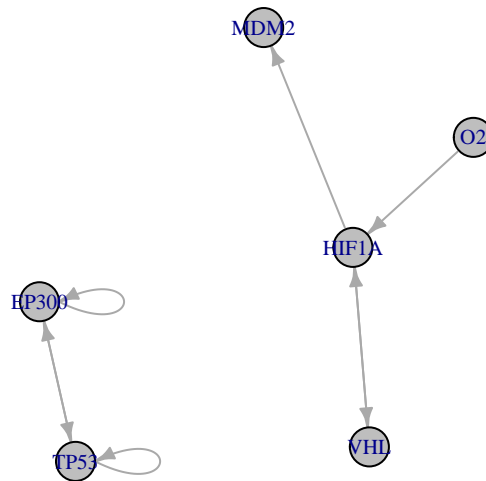
```

## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (!VHL) ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = 0 ( probability: 1, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = 0 ( probability: 1, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = (!O2) ( probability: 0.25, error: 0)
## TP53 = (!MDM2) ( probability: 0.25, error: 0)
## TP53 = (!HIF1A) ( probability: 0.25, error: 0)
## TP53 = (!EP300) ( probability: 0.25, error: 0)
##
## Alternative transition functions for gene VHL:

```

```
## VHL = (TP53) ( probability: 1, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## HIF1A = 0
## MDM2 = 0
## O2 = 0
```

```
net <- reconstructNetwork(glioma2x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)
```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (!TP53) ( probability: 0.5, error: 0)
## EP300 = (!EP300) ( probability: 0.5, error: 0)
```

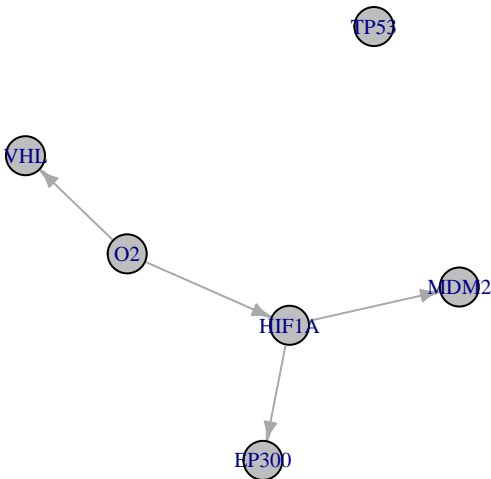


```

##
## Alternative transition functions for gene HIF1A:
## HIF1A = (O2) ( probability: 0.5, error: 0)
## HIF1A = (!VHL) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (!HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = (!TP53) ( probability: 0.5, error: 0)
## TP53 = (!EP300) ( probability: 0.5, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## O2 = 0

net <- reconstructNetwork(glioma3x, method="bestfit",returnPBN=TRUE,readableFunctions=TRUE)
plotNetworkWiring(net)

```



```
print(net)
```

```
## Probabilistic Boolean network with 6 genes
##
## Involved genes:
## EP300 HIF1A MDM2 TP53 VHL O2
##
## Transition functions:
##
## Alternative transition functions for gene EP300:
## EP300 = (HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene HIF1A:
## HIF1A = (O2) ( probability: 1, error: 0)
##
## Alternative transition functions for gene MDM2:
## MDM2 = (HIF1A) ( probability: 1, error: 0)
##
## Alternative transition functions for gene TP53:
## TP53 = 1 ( probability: 1, error: 0)
##
## Alternative transition functions for gene VHL:
## VHL = (!O2) ( probability: 1, error: 0)
##
## Alternative transition functions for gene O2:
## O2 = 0 ( probability: 1, error: 0)
##
## Knocked-out and over-expressed genes:
## TP53 = 1
## O2 = 0
```