Inferencia. Fase I

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Redes Bayesianas

Probabilistic reasoning on BNs works in the framework of Bayesian statistics and focuses on the computation of posterior probabilities or densities. For example, suppose we have learned a BN B with DAG G and parameters Θ . We want to use B to investigate the effects of a new piece of evidence E using the knowledge encoded in B, that is, to investigate the posterior distribution

$$P(\mathbf{X}|\mathbf{E}, \mathcal{B}) = P(\mathbf{X}|\mathbf{E}, \mathbf{G}, \Theta)$$

Questions that can be asked are called queries and are typically an event of interest. The two most common queries are conditional probability (CPQ) and maximum a posteriori (MAP) queries, also known as most probable explanation (MPE) queries

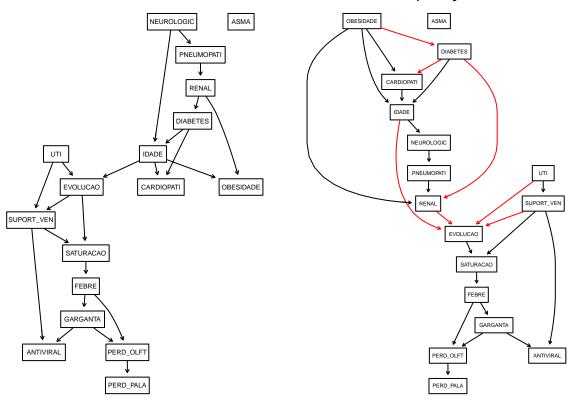
some content here

glimpse(ddf)

```
## Rows: 76,666
## Columns: 17
## $ IDADE
         <fct> "(37,73]", "(37,73]", "(73,109]", "(37,73]", "(73,109]", "(~
         <fct> 2, 2, 2, 1, 2, 1, 1, 1, 1, 2, 1, 2, 1, 2, 2, 1, 1, 2, 2, 2,~
## $ FEBRE
## $ GARGANTA
         ## $ SATURACAO
         <fct> 1, 1, 2, 2, 2, 2, 1, 2, 2, 1, 1, 1, 1, 2, 2, 2, 1, 2, 2,~
## $ EVOLUCAO
         <fct> 2, 1, 1, 1, 2, 1, 2, 2, 1, 2, 1,
                                 2, 2,
## $ RENAL
         ## $ DIABETES
         <fct> 2, 1, 2, 1, 2, 2, 2, 2, 1, 1, 1, 1, 1, 1, 1, 2, 2, 2, 2, 2, ~~
         <fct> 2, 2, 2, 2, 2, 2, 2,
## $ OBESIDADE
                          2, 2, 2, 2, 1, 2,
                                     2, 2, 1,
                                          2,
## $ PERD_OLFT
         2, 2, 1, 2,
## $ PERD_PALA
         ## $ PNEUMOPATI <fct> 2, 2, 2, 2, 2, 2,
                        2,
                          2, 2, 2, 2, 2, 2, 2,
                                       2, 2,
## $ UTI
         ## $ CARDIOPATI <fct> 2, 2, 2, 1, 1, 2, 2, 1, 1, 1, 1, 1, 1, 1, 2, 2, 1, 1, 1, 1, -
## $ SUPORT_VEN <fct> 2, 2, 2, 9, 3, 3, 2, 2, 3, 2, 2, 3, 1, 1, 3, 3, 2, 3, 9, 3,~
```

DAG sem WL

DAG com imposição de uma WL

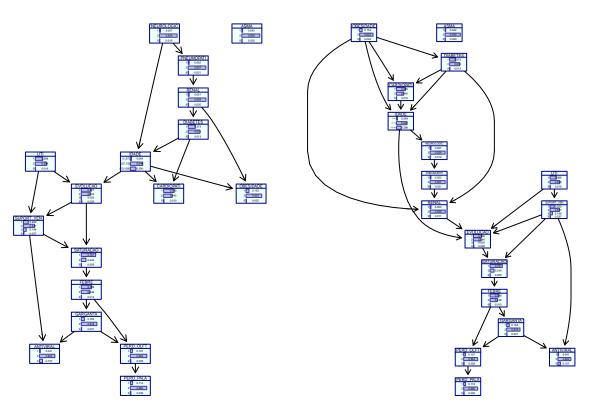


some content here

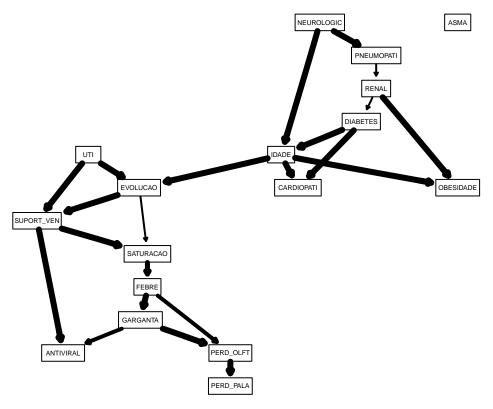
Warning in from.bn.fit.to.grain(x): NaN conditional probabilities in EVOLUCAO, ## replaced with a uniform distribution.

DAG sem WL

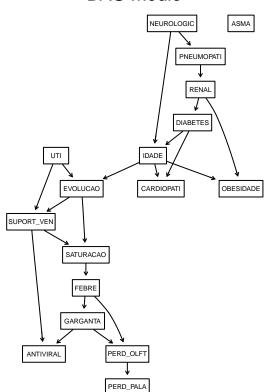
DAG com WL



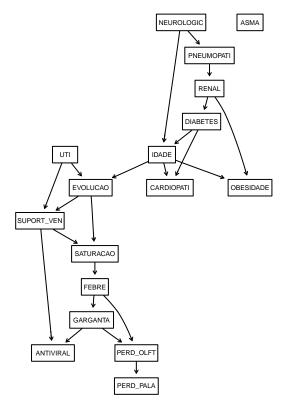
Iter = 300 Thr: 0.44666666666667

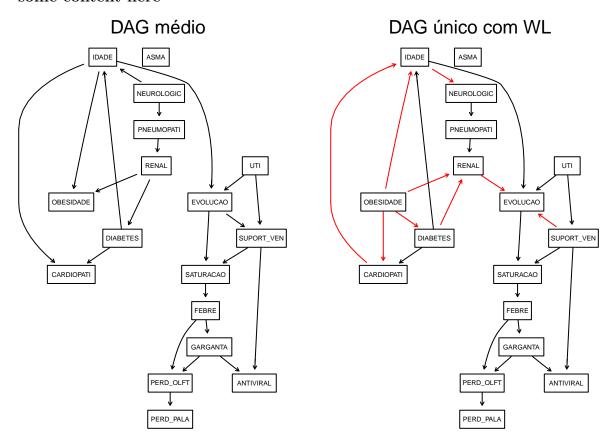


DAG médio



DAG único sem WL





DAG mínimo obtido

avg.diff

```
##
##
     Random/Generated Bayesian network
##
##
     model:
      [NEUROLOGIC] [UTI] [ASMA] [PNEUMOPATI | NEUROLOGIC] [RENAL | PNEUMOPATI]
##
      [DIABETES|RENAL] [IDADE|DIABETES:NEUROLOGIC] [EVOLUCAO|IDADE:UTI]
##
      [OBESIDADE|IDADE:RENAL] [CARDIOPATI|IDADE:DIABETES] [SUPORT_VEN|EVOLUCAO:UTI]
##
      [SATURACAO|EVOLUCAO:SUPORT_VEN] [FEBRE|SATURACAO] [GARGANTA|FEBRE]
##
##
      [PERD_OLFT|FEBRE:GARGANTA] [ANTIVIRAL|GARGANTA:SUPORT_VEN]
      [PERD_PALA|PERD_OLFT]
##
##
     nodes:
                                               17
                                               22
##
     arcs:
##
       undirected arcs:
                                               0
                                               22
##
       directed arcs:
                                               3.06
##
     average markov blanket size:
                                              2.59
     average neighbourhood size:
##
                                               1.29
##
     average branching factor:
##
##
     generation algorithm:
                                              Model Averaging
```

```
0.45
##
      significance threshold:
avg.simpler
##
      Random/Generated Bayesian network
##
##
##
      model:
       [FEBRE] [RENAL] [DIABETES] [NEUROLOGIC] [UTI] [ASMA] [IDADE | DIABETES: NEUROLOGIC]
##
       [GARGANTA|FEBRE] [PNEUMOPATI|NEUROLOGIC] [EVOLUCAO|IDADE:UTI]
##
##
       [OBESIDADE|IDADE:RENAL] [PERD_OLFT|GARGANTA] [CARDIOPATI|IDADE:DIABETES]
##
       [PERD_PALA|PERD_OLFT] [SUPORT_VEN|EVOLUCAO:UTI] [SATURACAO|SUPORT_VEN]
       [ANTIVIRAL|SUPORT_VEN]
##
##
     nodes:
                                                    17
##
                                                    16
      arcs:
##
        undirected arcs:
                                                    0
##
                                                    16
        directed arcs:
##
                                                    2.24
      average markov blanket size:
##
      average neighbourhood size:
                                                    1.88
##
      average branching factor:
                                                    0.94
##
##
      generation algorithm:
                                                    Model Averaging
##
      significance threshold:
                                                    0.95
                          NEUROLOGIC
                                         ASMA
                                                                    DIABETES
                                                                               NEUROLOGIC
                                                                                                  ASMA
                                                                                             FEBRE
                                PNEUMOPATI
                                 RENAL
                                                                            RENAL
                                                                                  PNEUMOPATI
                                                                                           GARGANTA
                               DIABETES
                                                          UTI
        UTI
                         IDADE
          EVOLUCAO
                         CARDIOPATI
                                        OBESIDADE
                                                                   CARDIOPATI
                                                                                           PERD_OLFT
                                                           EVOLUCAO
                                                                           OBESIDADE
SUPORT_VEN
           SATURAÇÃO
             FEBRE
                                                       SUPORT_VEN
                                                                                           PERD_PALA
           GARGANTA
```

PERD_OLFT

PERD_PALA

ANTIVIRAL

SATURAÇÃO

ANTIVIRAL