

This is a WinBUGS program for the artificial example in Chapter 12, Section 12.6.

Model: Nonlinear Structural Equation Model with nonignorable missing data

Data Set Names: YO.dat and IR.dat

Sample Size: N=712

```
model{
  for(i in 1:N){
    # structural equation
    xi[i,1:2]~dmnorm(u[1:2],phi[1:2,1:2])
    xxi[i]~dnorm(nu[i],psd)
    nu[i]<-gam[1]*xi[i,1]+gam[2]*xi[i,2]+gam[3]*xi[i,1]*xi[i,1]
    dthat[i]<-xxi[i]-nu[i]
    # missingness mechanism model
    for(j in 1:P){
      R[i,j]~dbern(pi[i,j])
      logit(pi[i,j])<- b[1]+b[2]*y[i,1]+b[3]*y[i,2]+b[4]*y[i,3]+b[5]*y[i,4]
        +b[6]*y[i,5]+b[7]*y[i,6]+b[8]*y[i,7]+b[9]*y[i,8]
    }
    # measurement models
    for(j in 1:P){
      y[i,j]~dnorm(mu[i,j],psi[j])
      ephat[i,j]<-y[i,j]-mu[i,j]
    }
    mu[i,1]<- vu[1]+xxi[i]
    mu[i,2]<- vu[2]+lam[1]*xxi[i]
    mu[i,3]<- vu[3]+xi[i,1]
    mu[i,4]<- vu[4]+lam[2]*xi[i,1]
    mu[i,5]<- vu[5]+lam[3]*xi[i,1]
    mu[i,6]<- vu[6]+xi[i,2]
    mu[i,7]<- vu[7]+lam[4]*xi[i,2]
    mu[i,8]<- vu[8]+lam[5]*xi[i,2]
  }

  # priors on loadings and coefficients
  vu[1]~dnorm(-0.145,4.0)    vu[2]~dnorm(-0.086,4.0)    vu[3]~dnorm(0.012,4.0)
  vu[4]~dnorm(0.004,4.0)    vu[5]~dnorm(-0.143,4.0)    vu[6]~dnorm(-0.036,4.0)
  vu[7]~dnorm(0.029,4.0)    vu[8]~dnorm(0.143,4.0)
  b[1]~dnorm(-2.798,4.0)    b[2]~dnorm(0.041,4.0)    b[3]~dnorm(-0.281,4.0)
  b[4]~dnorm(0.365,4.0)    b[5]~dnorm(-0.264,4.0)    b[6]~dnorm(-0.524,4.0)
  b[7]~dnorm(-0.275,4.0)    b[8]~dnorm(-0.061,4.0)    b[9]~dnorm(0.327,4.0)
  var.lam[1]<-4.0*psi[2]    var.lam[2]<-4.0*psi[4]    var.lam[3]<-4.0*psi[5]
  var.lam[4]<-4.0*psi[7]    var.lam[5]<-4.0*psi[8]    var.gam<-4.0*psd
  lam[1]~dnorm(0.490,var.lam[1])    lam[2]~dnorm(0.188,var.lam[2])
  lam[3]~dnorm(0.194,var.lam[3])    lam[4]~dnorm(0.537,var.lam[4])
  lam[5]~dnorm(0.226,var.lam[5])
  gam[1]~dnorm(-0.072,var.gam)    gam[2]~dnorm(-0.005,var.gam)
  gam[3]~dnorm(0.206,var.gam)

  # priors on precisions
  for(j in 1:P){
    psi[j]~dgamma(10.0,4.0)
    v[j]<-1/psi[j]
  }
  psd~dgamma(10.0,4.0)
```

```

vd<- 1/psd
phi[1:2,1:2]~dwish(RR[1:2,1:2],2)
phx[1:2,1:2]<- inverse(phi[1:2,1:2])
# put all the parameters' results into bb
for(j in 1:8){ bb[j]<- vu[j] }
for(j in 1:5){ bb[8+j]<- lam[j] }
for(j in 1:8){ bb[13+j]<- v[j] }
for(j in 1:3){ bb[21+j]<- gam[j] }
bb[25]<- vd
bb[26]<- phx[1,1]
bb[27]<- phx[1,2]
bb[28]<- phx[2,2]
for(j in 1:9){ bb[28+j]<- b[j] }
}# end of model

```

Data

```

list(N=712,P=8, u=c(0,0),
      RR=structure(.Data= c(2.3, 0.3,
                           0.3,1.6),
                   .Dim= c(2,2)),
      y=structure(.Data=c(paste YO.dat here), .Dim=c(712,8)),
      R=structure(.Data=c(paste IR.dat here), .Dim=c(712,8)))

```

Three different initial values

```

list(gam=c(-0.5,-0.5,-0.5), lam=c(-0.4,-0.4,-0.4,-0.4,-0.4), b=c(-0.2,-0.2,-0.2,-0.2,-0.2,-0.2,-0.2,-0.2,-0.2),
      psi=c(0.6,0.7,0.8,0.75,0.65,0.76,0.85,0.89), psd=0.27, vu=c(-0.1,-0.1,-0.1,-0.1,-0.1,-0.1,-0.1,-0.1,-0.1),
      phi=structure(.Data=c(0.42,0.0,
                           0.0,0.25),
                   .Dim=c(2,2)))

```

```

list(gam=c(0.5,0.5,0.5), lam=c(0.4,0.4,0.4,0.4,0.4), b=c(0.5,0.5,0.5,0.5,0.5,0.5,0.5,0.5,0.5),
      psi=c(0.3,0.47,0.48,0.5,0.35,0.36,0.45,0.49), psd=0.3, vu=c(0.1,0.1,0.1,0.1,0.1,0.1,0.1,0.1,0.1),
      phi=structure(.Data=c(0.57,-0.25,
                           -0.25,0.46),
                   .Dim=c(2,2)))

```

```

list(gam=c(0.0,0.0,0.0), lam=c(0.0,0.0,0.0,0.0,0.0), b=c(0.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0),
      psi=c(0.73,0.77,0.78,0.58,0.75,0.86,0.95,0.79), psd=0.2, vu=c(0.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0,0.0),
      phi=structure(.Data=c(0.51,-0.35,
                           -0.35,0.66),
                   .Dim=c(2,2)))

```