

1 COMBINING CAPTURE-RECAPTURE DATA AND PEDIGREE INFORMATION TO ASSESS HERITABILITY  
2 OF DEMOGRAPHIC PARAMETERS IN THE WILD. by Julien Papaix, Sarah Cubaynes, Mathieu  
3 Buoro, Anne Charmantier, Philippe Perret and Olivier Gimenez.

4 **Supporting Information 1: R script and BUGS code to implement the**  
5 **capture-recapture animal model**

6 **1 R script to run the capture-recapture animal model from**  
7 **OpenBUGS**

8 Here, we provide the R script which calls OpenBUGS to fit the capture-recapture animal model to  
9 the blue tit data. The pedigree and capture-recapture data are available from  
10 <http://www.cefe.cnrs.fr/biom/zips/CRAMcode.zip> or from the last author's webpage. Note that,  
11 due to confidentiality reasons, we provide only a random sub-sample of the whole data set here.

```
12 #####  
13 # R script to run the CRAM model (see CRAM.bug) using OpenBUGS  
14 # J. Papaix, O. Gimenez  
15 # April 2010  
16 #####  
17  
18 ##### DATA  
19  
20 # 1. a matrix "cr.ped" with  
21 col. 1      = individual id  
22 col. 2      = father id (NA if unknown)  
23 col. 3      = mother id (NA if unknown)  
24 col. 4-last = detections  
25 (NA if before first capture, 1 if individual is seen, 0 otherwise)  
26  
27 # 2. a vector "first" with occasion of first capture for each individual
```

```

1
2 ##### DATA MANIPULATION
3 x <- as.matrix(cr.ped[,4:32]) # Blue tit data, 29 occ. => 32 col. in cr.ped
4 ntot <- dim(x)[1] # total number of individuals
5 nyear <- dim(x)[2] # number of capture occasions
6 nasc <- 327 # number of individuals without recorded parents
7 ndesc <- ntot-nasc # number of individuals with recorded parents
8 ad <- seq((nasc+1),ntot) # pointer to obs. number for an ind. with recorded parents
9 nd <- seq(1,ndesc) # pointer to obs. number for an ind. without recorded parents
10 ped <- as.data.frame(cr.ped[,1:3]) # get the pedigree
11 dimnames(ped)[[2]] <- c("id","father","mother") # name columns of the pedigree
12 SID <- ped[,2] # sire id
13 DID <- ped[,3] # dam id
14 # load GeneticsPed package to work out the pedigree
15 # (http://www.bioconductor.org/packages/2.0/bioc/html/GeneticsPed.html)
16 library(GeneticsPed)
17 ped <- as.Pedigree(ped)
18 sq_D <- sqrt(diag(mendelianSamplingD(ped)))
19
20 ##### RUN OPENBUGS
21
22 # data
23 data <- list(x=x[(nasc+1):ntot,],first=first[(nasc+1):ntot],nyear=nyear,
24 sq_D=sq_D,nasc=nasc,ndesc=ndesc,ad=ad,nd=nd,SID=SID,DID=DID)
25
26 # initial values (2 chains)
27 z <- as.matrix((x[(nasc+1):ntot,] == 0) | (x[(nasc+1):ntot,] == 1))+0
28 init1 <- list(ptemp=0.5,beta=-0.8,z=z,sigma_gen=0.1,sigma_ngen=0.1,sigma_env=.4)
29 init2 <- list(ptemp=0.8,beta=0.4,z=z,sigma_gen=1,sigma_ngen=1,sigma_env=.2)
30 inits <- list(init1,init2)

```

```

1
2 # load R2WinBUGS package to run OpenBUGS from R
3 library(R2WinBUGS)
4
5 # parameters to be monitored
6 parameters <- c("ptemp","beta","sigma_env","sigma_gen","sigma_ngen","herit")
7
8 # run OpenBUGS
9 res.sim <- bugs(data,inits,parameters,"CRAM.bug",n.chains=2,n.iter=15000,
10   n.burn=5000,n.thin=10,program="OpenBUGS")
11
12 # display results
13 round(res.sim$summary,3)

```

## 14 **2 BUGS code implementing the capture-recapture animal model**

```

15 #####
16 # CRAM model in BUGS language
17 # J. Papaix, O. Gimenez
18 # April 2010
19 #
20 # Freely inspired from:
21 #
22 # Damgaard, L. H. 2007. Technical note: How to use WinBUGS to
23 # draw inferences in animal models.
24 # J. Anim. Sci., 85:1363-1368.
25 #
26 # Royle, J. A. 2008. Modeling individual effects in the
27 # Cormack-Jolly-Seber model: a state-space formulation.
28 # Biometrics, 64:364-370.

```

```

1 #
2 #####
3 model
4 {
5
6 ##### LIKELIHOOD
7
8 # state-space formulation
9 for(i in 1:ndesc){
10 z[i,first[i]] ~ dbern(1) # initial state
11 for(j in (first[i]+1):nyear){
12 mu2[i,j]<-PHI[i,j-1]*z[i,j-1]
13 z[i,j] ~ dbern(mu2[i,j]) # state equation
14 mu1[i,j]<-P[i,j-1]*z[i,j]
15 x[i,j] ~ dbern(mu1[i,j]) # observation equation
16 }
17 }
18
19 for(i in 1:ndesc){ # individuals with recorded parents
20 # genetic effect
21 a[ad[i]] <- v[ad[i]] * sigma_gen
22 v[ad[i]] <- gam[ad[i]] * sq_D[ad[i]] + (v[SID[ad[i]]] + v[DID[ad[i]]])/2
23 gam[ad[i]] ~ dnorm(0,1)
24 na[ad[i]] <- vna[ad[i]] * sigma_ngen
25 vna[ad[i]] ~ dnorm(0,1)
26
27 for(t in 1:(nyear-1)){
28 logit(P[i,t])<- lp[t] # logit link for time-dep detection probabilities
29 # mean survival + non-genetic + genetic + year effect
30 muphi[i,t] <- beta + na[ad[i]] + a[ad[i]] + eta[t]

```

```

1 PHI[i,t] <- phi(muphi[i,t]) # probit link on survival
2 }
3 }
4
5 for (i in 1:nasc){ # individuals without recorded parents
6 v[nd[i]] <- gam[nd[i]]* sq_D[nd[i]]
7 gam[nd[i]] ~ dnorm(0,1)
8 }
9
10 for(j in 1:(nyear-1)){
11 lp[j]<-log(ptemp/(1-ptemp)) # make the detection prob. constant through time
12 eta[j] ~ dnorm(0,tau_env) # temporal random effect on survival
13 }
14
15 ##### PRIORS
16
17 # prior on the detection probability
18 ptemp ~ dunif(0,1)
19
20 # prior on the mean survival probability
21 beta ~ dnorm(0,1.0E-1)
22
23 # prior on the SD of the non-genetic effect
24 sigma_ngen ~ dunif(0,10)
25 var_ngen <- sigma_ngen * sigma_ngen
26
27 # prior on the SD of the additive genetic effect
28 sigma_gen ~ dunif(0,10)
29 var_gen <- sigma_gen * sigma_gen
30

```

```
1 # prior on the SD of the temporal effect
2 sigma_env ~ dunif(0,10)
3 tau_env <- 1 / var_env
4 var_env <- sigma_env * sigma_env
5
6 # monitor heritability
7 herit <- var_gen / (var_gen + var_ngen + var_env + 1)
8
9 }
```