## Phantom Groups

LRS<br>CGIL<br>July-Aug 2012

## Incomplete Pedigrees

- Parent IDs are often missing.
- Animals are transfered to new owners.
- Animal IDs are changed (horses).
- On/Off Recording programs.
- Multiple sires, unattended births.
- Not all unknown parents belong to the same population of animals.


## How To Group



Then each of these are nested within year of birth of the animal.

## Example

| Animal | Sire | Dam | Gender | BYear |
| :---: | :---: | :---: | :---: | :---: |
| A |  |  | M | 2008 |
| B |  |  | F | 2009 |
| C |  |  | F | 2009 |
| D | A |  | M | 2009 |
| E |  | B | M | 2009 |

## Example

| Animal | Sire | Dam | Gender | BYear |
| :---: | :---: | :---: | :---: | :---: |
| A | SM8 | DM8 | M | 2008 |
| B | SF9 | DF9 | F | 2009 |
| C | SF9 | DF9 | F | 2009 |
| D | A | DM9 | M | 2009 |
| E | SM9 | B | M | 2009 |

Every animal has some parent identification after grouping.

## Group Model

$$
\mathbf{y}=\mathbf{X b}+\mathbf{Z Q g}+\mathbf{Z a}+\mathbf{e}
$$

where
a is the vector of animal additive genetic effects,
$\mathbf{Z}$ is the matrix that relates animals to their observations,
$g$ is the vector of genetic group effects, and
$\mathbf{Q}$ is the matrix that relates animals to their genetic groups, and $\mathbf{y}, \mathbf{X b}, \mathbf{e}$ are as described in earlier notes.
The Estimated Breeding Value, EBV, of an animal is equal to the sum of the group and animal solutions from MME, i.e.

$$
\text { Vector of EBVs }=\mathbf{Q} \hat{\mathbf{g}}+\hat{\mathbf{a}}
$$

## Q Matrix

| Animal | Row of Q |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | SM8 | DM8 | SF9 | DF9 | SM9 | DM9 |  |
| A | .5 | .5 | 0 | 0 | 0 | 0 |  |
| B | 0 | 0 | .5 | .5 | 0 | 0 |  |
| C | 0 | 0 | .5 | .5 | 0 | 0 |  |
| D | .25 | .25 | 0 | 0 | 0 | .5 |  |
| E | 0 | 0 | .25 | .25 | .5 | 0 |  |


| Animal | Row of Q |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | SM8 | DM8 | SF9 | DF9 | SM9 | DM9 |
| A | .5 | .5 | 0 | 0 | 0 | 0 |
| B | 0 | 0 | .5 | .5 | 0 | 0 |
| C | 0 | 0 | .5 | .5 | 0 | 0 |
| D | .25 | .25 | 0 | 0 | 0 | .5 |
| E | 0 | 0 | .25 | .25 | .5 | 0 |
| F(E,D) | .125 | .125 | .125 | .125 | .25 | .25 |

Every animal has some function of group effects in $\mathbf{Q}$.

## MME

$$
\left(\begin{array}{lll}
\mathbf{X}^{\prime} \mathbf{X} & \mathbf{X}^{\prime} \mathbf{Z Q} & \mathbf{X}^{\prime} \mathbf{Z} \\
\mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{X} & \mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{Z Q} & \mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{Z} \\
\mathbf{Z}^{\prime} \mathbf{X} & \mathbf{Z}^{\prime} \mathbf{Z Q} & \mathbf{Z}^{\prime} \mathbf{Z}+\mathbf{A}^{-1} \alpha
\end{array}\right)\left(\begin{array}{l}
\hat{\mathbf{b}} \\
\hat{\mathbf{g}} \\
\hat{\mathbf{a}}
\end{array}\right)=\left(\begin{array}{l}
\mathbf{X}^{\prime} \mathbf{y} \\
\mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{y} \\
\mathbf{Z}^{\prime} \mathbf{y}
\end{array}\right)
$$

$\mathbf{Q}^{\prime}$ times the third row subtracted from the second row gives

$$
\mathbf{Q}^{\prime} \mathbf{A}^{-1} \hat{\mathbf{a}} \alpha=\mathbf{0}
$$

Setting up Q painful and messy.

## Quaas-Pollak Transformation, 1981

$$
\begin{aligned}
\left(\begin{array}{c}
\hat{b} \\
\hat{\mathbf{g}} \\
\hat{a}
\end{array}\right) & =\left(\begin{array}{ccc}
\mathbf{1} & 0 & 0 \\
0 & 1 & 0 \\
0 & -\mathbf{Q} & \mathbf{1}
\end{array}\right)\left(\begin{array}{lll}
\mathbf{1} & 0 & 0 \\
0 & \mathbf{1} & 0 \\
0 & \mathbf{Q} & \mathbf{1}
\end{array}\right)\left(\begin{array}{c}
\hat{b} \\
\hat{\mathbf{g}} \\
\hat{\mathbf{a}}
\end{array}\right) \\
& =\left(\begin{array}{ccc}
1 & 0 & 0 \\
0 & \mathbf{1} & 0 \\
0 & -\mathbf{Q} & \mathbf{1}
\end{array}\right)\left(\begin{array}{c}
\hat{\mathbf{b}} \\
\hat{\mathbf{g}} \\
\mathbf{Q} \hat{g}+\hat{a}
\end{array}\right)
\end{aligned}
$$

## QP Transformation

$$
\left(\begin{array}{ccc}
1 & 0 & 0 \\
0 & 1 & -\mathbf{Q}^{\prime} \\
0 & 0 & \mathbf{1}
\end{array}\right)\left(\begin{array}{lll}
\mathbf{X}^{\prime} \mathbf{X} & \mathbf{X}^{\prime} \mathbf{Z Q} & \mathbf{X}^{\prime} \mathbf{Z} \\
\mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{X} & \mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{Z Q} & \mathbf{Q}^{\prime} \mathbf{Z}^{\prime} \mathbf{Z} \\
\mathbf{Z}^{\prime} \mathbf{X} & \mathbf{Z}^{\prime} \mathbf{Z Q} & \mathbf{Z}^{\prime} \mathbf{Z}+\mathbf{A}^{-1} \alpha
\end{array}\right)\left(\begin{array}{lll}
\mathbf{1} & \mathbf{0} & \mathbf{0} \\
\mathbf{0} & \mathbf{1} & 0 \\
0 & -\mathbf{Q} & \mathbf{1}
\end{array}\right)
$$

$$
=\left(\begin{array}{ccc}
\mathbf{X}^{\prime} \mathbf{X} & \mathbf{0} & \mathbf{X}^{\prime} \mathbf{Z} \\
\mathbf{0} & \mathbf{Q}^{\prime} \mathbf{A}^{-1} \mathbf{Q} \alpha & -\mathbf{Q}^{\prime} \mathbf{A}^{-1} \alpha \\
\mathbf{Z}^{\prime} \mathbf{X} & -\mathbf{A}^{-1} \mathbf{Q} \alpha & \mathbf{Z}^{\prime} \mathbf{Z}+\mathbf{A}^{-1} \alpha
\end{array}\right)\left(\begin{array}{c}
\hat{\mathbf{b}} \\
\hat{\mathbf{g}} \\
\mathbf{Q} \hat{\mathbf{g}}+\hat{\mathbf{a}}
\end{array}\right)
$$

and

$$
\left(\begin{array}{ccc}
1 & 0 & 0 \\
0 & 1 & -Q^{\prime} \\
0 & 0 & 1
\end{array}\right)\left(\begin{array}{l}
X^{\prime} y \\
Q^{\prime} Z^{\prime} y \\
Z^{\prime} y
\end{array}\right)=\left(\begin{array}{c}
X^{\prime} y \\
0 \\
Z^{\prime} y
\end{array}\right)
$$

## Quaas, 1988

- Dick Quaas noticed that $\mathbf{Q}^{\prime} \mathbf{A}^{-1} \mathbf{Q}$ and $-\mathbf{Q}^{\prime} \mathbf{A}^{-\mathbf{1}}$ had properties that followed Henderson's rules for forming $\mathbf{A}^{\mathbf{- 1}}$.
- Calculate $b_{i i}$ values for all animals in pedigree as already discussed.
- Add phantom groups to the pedigree. Let their $b_{i i}=1$.
- Create $\mathbf{A}^{-1}$ for all real animals, but allow for phantom groups to be part of $\mathbf{A}^{\mathbf{- 1}}$.


## Example

|  | A | D | SM8 | DM8 | SM9 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| A | 1 |  | -.5 | -.5 |  |
| D |  |  |  |  |  |
| SM8 | -.5 |  | .25 | .25 |  |
| DM8 | -.5 |  | .25 | .25 |  |
| SM9 |  |  |  |  |  |

## Example

|  | A | D | SM | DM | SM 9 |
| :---: | :---: | :---: | :---: | :---: | :---: |
| A | $1 \frac{1}{3}$ | $-\frac{2}{3}$ | -.5 | -.5 | $\frac{1}{3}$ |
| D | $-\frac{2}{3}$ | $\frac{4}{3}$ |  |  | $-\frac{2}{3}$ |
| SM8 | -.5 |  | .25 | .25 |  |
| DM8 | -.5 |  | .25 | .25 |  |
| SM9 | $\frac{1}{3}$ | $-\frac{2}{3}$ |  |  | $\frac{1}{3}$ |

## Computing Issues

- Group effects are fixed effects, rank could be less than number of groups (confounding). Sometimes very large solutions for group effects.
- Overlapping groups to break confounding.
- Pretend groups are animals with $b_{i i}=1$, then add 1 to group diagonals of $\mathbf{A}^{-1}$. Group solutions then add to zero, dependencies removed.


## Multiple Sires

In some species females are housed with several males, so that the sire at mating is unknown without blood testing sires and progeny. How can $\mathbf{A}$ and $\mathbf{A}^{-1}$ be modified?
Suppose female $X$ was kept with sires $A$ and $B$, each equally likely to have sired the progeny, $Z$.

|  | A | B | X | Z |
| :---: | :---: | :---: | :---: | :---: |
| A | 1 | 0 | 0 | $\frac{1}{4}$ |
| B | 0 | 1 | 0 | $\frac{1}{4}$ |
| X | 0 | 0 | 1 | $\frac{1}{2}$ |
| Z | $\frac{1}{4}$ | $\frac{1}{4}$ | $\frac{1}{2}$ | 1 |

## Simulation of Data

Simulation is one way of improving one's understanding of a model, a data set, a method, or a system.

$$
y_{i j k}=Y_{i}+C_{j}+a_{k}+e_{i j k}
$$

where
$y_{i j k}$ is the observed trait, one record per animal,
$Y_{i}$ is a fixed year effect,
$C_{j}$ is a random contemporary group effect,
$a_{k}$ is a random animal additive genetic effect,
$e_{i j k}$ is a random residual effect.

## Details

- Years $=10$
- Contemporary groups $=50$ to 100 per year
- $\sigma_{e}^{2}=64=1.6 \sigma_{a}^{2}=4 \sigma_{c}^{2}$
- Number of animals, up to 20000
- Base animals $=200$
- Number of breeding animals per year
- 5 to 15 animals per CG


## Initialization

```
zlrs = file.choose() # find lrscrips.R
source(zlrs)
zbill = file.choose() # find Bills.R
zrclib = file.choose() # find rclib.dll
dyn.load(zrclib)
source(zbill)
NAM = 20000 # max number of animals
nyr = 10
SDa = sqrt(64/1.6)
SDc = sqrt(64/4)
SDe = 8
mbase = 200
tbv = rep(0,NAM) # also inbb, inbc, sid, did,
obs, year, cgrp, anwr, bi, fi, atbv, sel
```


## Initiate

```
xpdint(NAM)
YRFX = c(50, 53, 52, 55, 54, 51, 57, 56, 58, 59)
for(i in 1:mbase){
        ks=0; kd=0
        inbc[i] = xpdadd(ks,kd)
        inbb[i]=1
    }
sel[1:mbase] = 50 + rnorm(mbase,0,SDa)
aid = c(1:NAM)
nba = 200; nanim = mbase; nrec=0
cgid = 0
```


## Year Loop

```
for(iyr in 1:nyr)\{
    \# how many CG in this year?
    \(\mathrm{ncg}=\operatorname{sample}(\mathrm{c}(50: 100), 1)\)
    ka \(=\) order (-sel) \# order all animals
    \(\mathrm{B}=\mathrm{aid}[\mathrm{ka}]\)
    \(B=B[1: n b a]\) \# keep the best for breeding
    Loop for CG
```

\}

## CG Loop

```
for(icg in 1:ncg) \{
    \# How many animals in CG?
    mams \(=\) sample \((c(5: 15), 1)\)
    cgfx \(=\operatorname{rnorm}(1,0, S D c)\)
    cgid = cgid + 1
```

    Loop for Animals
    \}

## Animal Loop

```
for(k in 1:mams){
    # Pick parents, any two in B
    nanim = nanim + 1
    nrec = nrec + 1
    parents = sample(B,2,replace=FALSE)
    ksir = parents[1]; kdam=parents[2]
    inbc[nanim] = xpdadd(ksir,kdam)
    inbb[nanim] = xpdd(nanim)
    x = sqrt(inbb[nanim])*SDa
    tbv[nanim] = 0.5*(tbv[ksir]+tbv[kdam])+rnorm(1,0,x)
    # Make the record
```


## Record Making

```
\# Make the record
    obs [nrec]=YRFX[iyr]+cgfx+tbv [nanim]+rnorm(1,0,SDe)
    year \([n r e c]=\) iyr; \(\quad \operatorname{cgrp}[n r e c]=\) cgid
    anwr [nrec] = nanim \# animals with records
    sid[nrec] = ks; did[nrec] = kd
    bi[nrec] = inbb[nanim]
    atbv[nrec] = tbv[nanim] \}
    sel = tbv[1:nanim] + rnorm(nanim, \(0, \mathrm{SDe} * 2\) )
\}
\}
```


## Save Data

```
obs = round(obs) # round off to whole numbers
MYdat = data.frame(anwr,sid,did,year,cgrp,bi,fi,obs,atbv)
MTdat2 = MYdat[1:nrec, ]
save(MYdat2,file="Larry.Rdata")
```

Generate your data. Retrieve program from website.

## Solving MME

- Read in data frame
- Form pedigrees and diagonals of $\mathbf{A}^{-1}$
- Initialize solutions, variance parameters
- Iterate on Data
- Summarize Results


## Read Data Frame

```
load(file="Larry.Rdata")
names(MYdat2)
nrec = nrow(MYdat2)
obs = MYdat2$obs; yrfac = MYdat2$year
cgfac = MYdat2$cgrp; anwr = MYdat2$anwr
bi = MYdat2$bi; fi=MYdat2$fi
aid = MYdat2$anwr; sid=MYdat2$sid; did=MYdat2$did
atbv = MYdat2$atbv
```


## Pedigree Prep

```
mmm = aid[1] - 1
NP = aid[length(aid)]+1
sanm = rep(0,NP); syr=rep(0,NP); scg=rep(0,NP)
aaid = c(1:mmm, aid, NP)
ssid = c(rep(NP,mmm), sid, NP) #all non-zero
ddid = c(rep(NP,mmm), did, NP) #all non-zero
bbi = aaid*O; mwr = mmm + 1
nam = length(aaid) - 1
bbi[1:mmm]=1; bbi[mwr:nam]=bi; bbi[NP]=0
```


## More Pedigree Prep

```
mtotal = length(aaid)
adiag = rep(0,mtotal)
for(i in 1:nam){
    kis = ssid[i]; kid = ddid[i]
    d = 1/bbi[i]; x = 0.25*d
    adiag[i] = adiag[i] + d
    adiag[kis] = adiag[kis] + x
        adiag[kid] = adiag[kid] + x
    }
    adiag[NP]=0
    zz = c(rep (0,mmm),rep (1,nrec),0)
```


## Initialize

```
iters = 0; nmax = 10000; ccc = 100
vare = 64; alpha = 1.6; alphc = 4
while( ccc > 0.000001){
    iters = iters + 1
```


## Year Effects - fixed

```
rhs = (obs - sanm[aid] - scg[cgfac])
syr = tapply(rhs,yrfac,mean) # new solutions
```


## CG Effects - random

```
rhs = (obs - sanm[aid] - syr[yrfac])
dcg = tapply(rep(1,nrec),cgfac,sum) + alphac
scg = tapply(rhs,yrfac,sum)/dcg # new solutions
```


## Animal BV - random

```
rhs = (obs - scg[cgfac] - syr[yrfac])
rhs = c( rep(0,mmm),tapply(rhs,aid,sum),0)
ccd = 0; ccs = 0
for(i in nam:1) {
    kis = ssid[i]; kid = ddid[i]; d = alpha/bbi[i]
    x = zz[i] + alpha*adiag[i]
    rhs[i]=rhs[i] + 0.5*d*(sanm[kis]+sanm[kid])
    anew = rhs[i]/x
    diff = anew - sanm[i]
    ccd = ccd + diff*diff
    ccs = ccs + anew*anew
    sanm[i] = anew
    rhs[kis]=rhs[kis]+d*(0.5*sanm[i] - 0.25*sanm[kid])
    rhs[kid]=rhs[kid]+d*(0.5*sanm[i] - 0.25*sanm[kis])
    }
```


## End Game

```
    if(iters>nmax)ccc=0
    } # end of while loop
ebv = sanm[aid] # only for those with records
gtrnd = tapply(ebv,yrfac,mean)
truet = tapply(atbv,yrfac,mean)
plot(gtrnd,type="b", lwd=3, col="red",
    xlab="Year of Birth", ylab="Trait Units")
lines(truet,type="b", lwd=3, col="blue")
title(main="Genetic Change By Year of Birth")
cor(ebv,atbv)
```

