Guided notes and code for terminal investment

Brad Duthie
10 April 2016

Starting summary

Here are some essential notes and R code toward the goal of producing a complete manuscript on terminal investment. This includes the most important bits of the TerminalInvestment.R (minus some of the early plots that showed survival and fecundity curves – these are echoed out). The last major change made to the R file was to make terminal investment in fecundity proportional to age (edited 10 DEC 2015).

R code summary

First we define all of the survival and fecundity functions. These include 1) constant, 2) increasing, 3) decreasing, 4) hump-shaped, and 5) u-shaped functions of age. Each function has a low and a high. We start with functions in which survival and fecundity do not change with age.

```
# Low fecundities and survival probabilities:
constantF.Pr.lo <- function(age) rep(2,length(age)); # Fecundity at age</pre>
constantP.Pr.lo <- function(age) rep(0.2,length(age)); # Probability of survival age
constantP.Cu.lo <- function(age){ # Cumulative probability of surviving to age.
    all
           <- 1:max(age);
    ret
           <- rep(0,length(all));
           <- 1; # Probability of being at age zero (must be one, starting point).
    for(i in 1:length(all)){
        ret[i] <- tot * constantP.Pr.lo(i);</pre>
               <- ret[i];
        tot
    return(ret[age]);
# High fecundities and survival probabilities:
constantF.Pr.hi <- function(age) rep(8,length(age)); # Fecundity at age</pre>
constantP.Pr.hi <- function(age) rep(0.8,length(age)); # Probability of survival age</pre>
constantP.Cu.hi <- function(age){ # Cumulative probability of surviving to age.
    all
           <- 1:max(age);
           <- rep(0,length(all));
    ret
           <- 1; # Probability of being at age zero (must be one, starting point).
    for(i in 1:length(all)){
        ret[i] <- tot * constantP.Pr.hi(i);</pre>
               <- ret[i];
    return(ret[age]);
}
```

Next, we have the functions in which survival and fecundity increase with increasing age. To avoid creating a divergent series, increases are not linear, but asymptote to some value as $m \to \infty$. Survival probability plateaus at ca 0.692 and 0.99 for low and high probability, respectively.

```
# Low fecundities and survival probabilities:
exponeupF.Pr.lo <- function(age){</pre>
    ret <- rep(0,length(age));</pre>
    tot <- 0;
    for(i in 1:length(age)){
         ret[i] \leftarrow 1 * sum(1/((5/4)^{((1:i)-1))}) - 1;
    }
    return(ret);
}
exponeupP.Pr.lo <- function(age) {</pre>
    ret <- rep(0,length(age));</pre>
    tot <- 0;
    for(i in 1:length(age)){
        ret[i] \leftarrow (198/1000) * sum(1/((4/3)^((1:age[i])-1))) - 0.1;
    }
    return(ret);
exponeupP.Cu.lo <- function(age){</pre>
    all <- 1:max(age);</pre>
    ret <- rep(0,length(all));</pre>
    tot <- 1;
    for(i in 1:length(all)){
        ret[i] <- tot * exponeupP.Pr.lo(i);</pre>
                <- ret[i];
        tot
    }
    return(ret[age]);
}
# High fecundities and survival probabilities:
exponeupF.Pr.hi <- function(age){</pre>
    ret <- rep(0,length(age));</pre>
    tot <- 0;
    for(i in 1:length(age)){
        ret[i] \leftarrow 2 * sum(1/((10/9)^{(1:i)-1)))
    return(ret);
}
exponeupP.Pr.hi <- function(age) {</pre>
    ret <- rep(0,length(age));</pre>
    tot <- 0;
    for(i in 1:length(age)){
        ret[i] \leftarrow (198/1000) * sum(1/((5/4)^((1:age[i])-1)))
    return(ret);
exponeupP.Cu.hi <- function(age){</pre>
    all <- 1:max(age);
    ret <- rep(0,length(all));</pre>
    tot <- 1;
    for(i in 1:length(all)){
        ret[i] <- tot * exponeupP.Pr.hi(i);</pre>
        tot <- ret[i];
```

```
}
return(ret[age]);
}
```

Next, we have the functions in which survival and fecundity increase with increasing age. As with the increasing functions above, decreasing survival and fecundity are also not linear, but decay exponentially to some positive real value.

```
# Low fecundities and survival probabilities:
exponednF.Pr.lo <- function(age){</pre>
    ret <- rep(0,length(age));</pre>
    for(i in 1:length(age)){
        ret[i] \leftarrow (15) * exp(-(10/40)*age[i]);
    return(ret);
}
exponednP.Pr.lo <- function(age){</pre>
    ret <- rep(0,length(age));</pre>
    for(i in 1:length(age)){
        ret[i] \leftarrow (0.5) * exp(-(10/40)*age[i]);
    }
    return(ret);
}
exponednP.Cu.lo <- function(age){</pre>
    all <- 1:max(age);
    ret <- rep(0,length(all));</pre>
    tot <- 1;
    for(i in 1:length(all)){
        ret[i] <- tot * exponednP.Pr.lo(i);</pre>
                <- ret[i];
    }
    return(ret[age]);
# High fecundities and survival probabilities:
exponednF.Pr.hi <- function(age){</pre>
    ret <- rep(0,length(age));</pre>
    for(i in 1:length(age)){
        ret[i] \leftarrow (30) * exp(-(5/40)*age[i]);
    }
    return(ret);
exponednP.Pr.hi <- function(age){
    ret <- rep(0,length(age));</pre>
    for(i in 1:length(age)){
        ret[i] \leftarrow (1) * exp(-(5/40)*age[i]);
    }
    return(ret);
exponednP.Cu.hi <- function(age){
    all <- 1:max(age);
    ret <- rep(0,length(all));</pre>
    tot <- 1;
    for(i in 1:length(all)){
```

```
ret[i] <- tot * exponednP.Pr.hi(i);
    tot <- ret[i];
}
return(ret[age]);
}</pre>
```

Next, we have hump-shaped survival probabilities and fecundities, in which some maximum value occurs in the middle of life, with lower values for low and high ages.

```
# Low fecundities and survival probabilities:
humpedshP.Cu.lo <- function(age,sd=5){</pre>
   all <- 1:max(age);
   ret <- rep(0,length(all));</pre>
   tot <- 1;
   for(i in 1:length(all)){
      ret[i] <- tot * humpedshP.Pr.lo(i,sd);</pre>
            <- ret[i];
   }
   return(ret[age]);
}
# High fecundities and survival probabilities:
humpedshF.Pr.hi <- function(age,sd=5) 20 * (1/sd*sqrt(2*pi))*exp(-1*((age - 10)^2/(2*sd*sd)));
humpedshP.Pr.hi <- function(age,sd=5) 2 * (1/sd*sqrt(2*pi))*exp(-1*((age - 10)^2/(2*sd*sd)));
humpedshP.Cu.hi <- function(age,sd=5){</pre>
   all <- 1:max(age);
   ret <- rep(0,length(all));</pre>
   tot <- 1;
   for(i in 1:length(all)){
      ret[i] <- tot * humpedshP.Pr.hi(i,sd);</pre>
      tot
            <- ret[i];
   }
   return(ret[age]);
}
```

Lastly, we consider u-shaped survival probabilities and fecundities, in which a minimum value occurs in the middle of life, with higher values for low and high ages.

```
# Low fecundities and survival probabilities:
UshF.Pr.lo <- function(age,sd=5) 10 - 18*(1/sd*sqrt(2*pi))*exp(-1*((age - 10)^2/(2*sd*sd)));
UshP.Pr.lo <- function(age,sd=5) 0.6 - (1/sd*sqrt(2*pi))*exp(-1*((age - 10)^2/(2*sd*sd)));
UshP.Cu.lo <- function(age,sd=5){
    all <- 1:max(age);
    ret <- rep(0,length(all));
    tot <- 1;
    for(i in 1:length(all)){
        ret[i] <- tot * UshP.Pr.lo(i,sd);
        tot <- ret[i];
    }
    return(ret[age]);
}
# High fecundities and survival probabilities:</pre>
```

Using the above survival and fecundity curves, we can predict terminal investment using the equation derived from our modelling work,

$$\Delta m_x + \frac{\Delta RV_0 \left(m_x + \Delta m_x \right)}{2 + RV_0} > RV_x'$$

In the above, m_x is fecundity at age x, while Δm_x is the gain in fecundity from terminally investing in age x. Similarly, RV_0 is the reproductive value of offspring, and ΔRV_0 is the increase in the reproductive value of offspring after termainal investment. The term RV_x' is the residual reproductive value of an individual that does not terminally invest. Hence, terminal investment increases fitness if the left-hand side of the above equation is greater than the residual reproductive value of a female. To analyse our model, we define the equivalent function in R below.

```
lhs <- function(Dmx, DRVO, mx, RVO, RVx){
    ti <- Dmx + (DRVO * (mx + Dmx)) / (2 + RVO);
    if(ti > RVx){
        return(1);
    }else{
        return(0);
    }
}
```

The above R function thereby returns a 1 if terminal investment increases fitness, and a 0 if it does not. The inputs of this function include $Dmx = \Delta m_x$, $DRVO = \Delta RV_0$, $mx = m_x$, $RVO = RV_0$, and $RVx = RV'_x$. We will now use it, along with the above defined functions of survival and fecundity, to predict terminal investment. The code below is a function to predict terminal investment across a range of ages (considers 1 through yr) and for different functions of fecundity and survival. In the below, yF represents the maximum percentage that we might reasonably consider fecundity could increase for a particular age – below we assume a maximum possible terminal investment of 100 percent of the age-specific fecundity. Similarly, yR represents the maximum possible increase in offspring reproductive value (which should not change with the age of the parent) – below we assume that parents might be able to increase the RV of their offspring by no more than 100 percent.

```
TIspace <- function(FecFun,SurFun,yr=20,yF=1,yR=1){
    resvals <- rep(x=0, times=yr+1);
    termi <- 1000;
    for(i in 1:(yr+1)){
        resvals[i] <- sum((SurFun(i:termi)/SurFun(i))*FecFun(i:termi));
    }
    Fpar <- seq(from=0, to=yF, length.out=100);
    Rpar <- seq(from=0, to=yR, length.out=100);</pre>
```

```
Space <- array(data=0,dim=c(100,100,yr));</pre>
    for(age in 1:dim(Space)[3]){
        for(i in 1:dim(Space)[1]){
            for(j in 1:dim(Space)[2]){
                CHECK <- lhs( Dmx = Fpar[i] * FecFun(i), # TI in fecundity
                              DRVO = Rpar[j],
                                                                 # TI in RV of offspring
                              mx = FecFun(age),
                                                                # Age fecundity
                              RVO = resvals[1],
                                                                # Offspring RV
                                                                # RV at age x
                              RVx = resvals[age+1]
                        );
                Space[i,j,age] <- CHECK;</pre>
            }
       }
   }
   return(Space);
}
```

Below we can create a list of all the fecundity functions Ffun and all the survival functions Sfun.

We can then loop through these lists to find where terminal investment is predicted.

```
rmat <- NULL;
for(i in 1:length(Ffun)){
  for(j in 1:length(Sfun)){
    chk <- TIspace(FecFun=Ffun[[i]], SurFun=Sfun[[j]]);
    tot <- sum(chk);
    res <- c(Ffunl[i], Sfunl[j], tot);
    rmat <- rbind(rmat,res);
  }
}
colnames(rmat) <- c("Fecundity", "Survival", "TI sum");
ord <- order(x=as.numeric(rmat[,3]),decreasing=TRUE);
print(rmat[ord,]);</pre>
```

```
## Fecundity Survival TI sum

## res "UshF.Pr.lo" "exponednP.Cu.lo" "106407"

## res "UshF.Pr.lo" "constantP.Cu.lo" "90902"

## res "UshF.Pr.lo" "humpedshP.Cu.lo" "87994"

## res "UshF.Pr.lo" "exponednP.Cu.hi" "85861"
```

```
"UshP.Cu.lo"
## res "UshF.Pr.lo"
                                            "76096"
## res "UshF.Pr.hi"
                         "exponednP.Cu.lo" "70739"
## res "UshF.Pr.hi"
                         "constantP.Cu.lo" "49703"
## res "UshF.Pr.hi"
                         "exponednP.Cu.hi" "42927"
## res "UshF.Pr.hi"
                         "UshP.Cu.lo"
                                            "42389"
## res "UshF.Pr.hi"
                         "humpedshP.Cu.lo" "30624"
## res "constantF.Pr.lo"
                         "exponednP.Cu.lo" "28823"
## res "UshF.Pr.lo"
                         "exponeupP.Cu.lo" "26991"
## res "exponeupF.Pr.hi"
                         "exponednP.Cu.lo" "20056"
## res "UshF.Pr.lo"
                         "humpedshP.Cu.hi" "13636"
  res "constantF.Pr.hi"
                         "exponednP.Cu.lo" "9076"
## res "constantF.Pr.lo" "humpedshP.Cu.lo" "8301"
  res "constantF.Pr.lo" "constantP.Cu.lo" "7600"
  res "exponeupF.Pr.hi" "humpedshP.Cu.lo" "4081"
## res "constantF.Pr.lo" "UshP.Cu.lo"
## res "constantF.Pr.lo" "exponednP.Cu.hi" "3237"
  res "constantF.Pr.lo" "humpedshP.Cu.hi" "3159"
  res "exponednF.Pr.lo" "exponednP.Cu.lo" "3057"
## res "exponednF.Pr.lo" "humpedshP.Cu.lo" "2814"
## res "exponednF.Pr.lo" "exponednP.Cu.hi" "2595"
## res "exponednF.Pr.lo" "humpedshP.Cu.hi" "2499"
## res "exponednF.Pr.lo" "constantP.Cu.lo" "2247"
## res "constantF.Pr.hi" "humpedshP.Cu.lo" "1586"
## res "humpedshF.Pr.lo" "humpedshP.Cu.lo" "1310"
## res "UshF.Pr.hi"
                         "humpedshP.Cu.hi" "1303"
## res "humpedshF.Pr.lo" "exponednP.Cu.lo" "1287"
## res "humpedshF.Pr.hi" "humpedshP.Cu.lo" "1006"
  res "humpedshF.Pr.hi" "exponednP.Cu.lo" "973"
  res "humpedshF.Pr.lo" "humpedshP.Cu.hi" "948"
## res "humpedshF.Pr.lo" "constantP.Cu.lo" "937"
## res "exponednF.Pr.lo" "UshP.Cu.lo"
  res "humpedshF.Pr.lo" "exponednP.Cu.hi" "687"
  res "humpedshF.Pr.hi" "humpedshP.Cu.hi" "687"
## res "humpedshF.Pr.hi" "constantP.Cu.lo" "668"
## res "humpedshF.Pr.hi" "exponednP.Cu.hi" "580"
## res "exponeupF.Pr.hi" "humpedshP.Cu.hi" "423"
## res "constantF.Pr.hi" "humpedshP.Cu.hi" "298"
## res "exponednF.Pr.lo" "exponeupP.Cu.lo" "290"
## res "humpedshF.Pr.lo" "UshP.Cu.lo"
                                            "134"
## res "exponeupF.Pr.hi" "UshP.Cu.lo"
                                            "66"
## res "humpedshF.Pr.lo" "exponeupP.Cu.lo" "48"
## res "constantF.Pr.hi" "UshP.Cu.lo"
                                            "19"
## res "constantF.Pr.hi" "exponednP.Cu.hi" "16"
  res "humpedshF.Pr.hi" "UshP.Cu.lo"
                                            "4"
                                           "3"
## res "exponeupF.Pr.hi" "exponednP.Cu.hi"
## res "constantF.Pr.lo" "constantP.Cu.hi"
## res "constantF.Pr.lo" "exponeupP.Cu.lo"
  res "constantF.Pr.lo" "exponeupP.Cu.hi"
## res "constantF.Pr.lo" "UshP.Cu.hi"
## res "constantF.Pr.hi" "constantP.Cu.lo" "0"
  res "constantF.Pr.hi" "constantP.Cu.hi"
## res "constantF.Pr.hi" "exponeupP.Cu.lo"
## res "constantF.Pr.hi" "exponeupP.Cu.hi"
## res "constantF.Pr.hi" "UshP.Cu.hi"
                                            "0"
```

```
## res "exponeupF.Pr.lo" "constantP.Cu.lo" "0"
## res "exponeupF.Pr.lo" "constantP.Cu.hi" "0"
## res "exponeupF.Pr.lo" "exponeupP.Cu.lo" "0"
## res "exponeupF.Pr.lo" "exponeupP.Cu.hi" "0"
## res "exponeupF.Pr.lo" "exponednP.Cu.lo" "0"
## res "exponeupF.Pr.lo" "exponednP.Cu.hi" "0"
## res "exponeupF.Pr.lo" "humpedshP.Cu.lo" "0"
## res "exponeupF.Pr.lo" "humpedshP.Cu.hi" "0"
## res "exponeupF.Pr.lo" "UshP.Cu.lo"
## res "exponeupF.Pr.lo" "UshP.Cu.hi"
## res "exponeupF.Pr.hi" "constantP.Cu.lo" "0"
## res "exponeupF.Pr.hi" "constantP.Cu.hi"
## res "exponeupF.Pr.hi" "exponeupP.Cu.lo" "0"
## res "exponeupF.Pr.hi" "exponeupP.Cu.hi" "0"
## res "exponeupF.Pr.hi" "UshP.Cu.hi"
## res "exponednF.Pr.lo" "constantP.Cu.hi" "0"
## res "exponednF.Pr.lo" "exponeupP.Cu.hi" "0"
## res "exponednF.Pr.lo" "UshP.Cu.hi"
## res "exponednF.Pr.hi" "constantP.Cu.lo" "0"
## res "exponednF.Pr.hi" "constantP.Cu.hi" "0"
## res "exponednF.Pr.hi" "exponeupP.Cu.lo" "0"
## res "exponednF.Pr.hi" "exponeupP.Cu.hi" "0"
## res "exponednF.Pr.hi" "exponednP.Cu.lo"
## res "exponednF.Pr.hi" "exponednP.Cu.hi"
## res "exponednF.Pr.hi" "humpedshP.Cu.lo"
## res "exponednF.Pr.hi" "humpedshP.Cu.hi"
## res "exponednF.Pr.hi" "UshP.Cu.lo"
## res "exponednF.Pr.hi" "UshP.Cu.hi"
## res "humpedshF.Pr.lo" "constantP.Cu.hi" "0"
## res "humpedshF.Pr.lo" "exponeupP.Cu.hi"
## res "humpedshF.Pr.lo" "UshP.Cu.hi"
## res "humpedshF.Pr.hi" "constantP.Cu.hi"
## res "humpedshF.Pr.hi" "exponeupP.Cu.lo"
## res "humpedshF.Pr.hi" "exponeupP.Cu.hi"
## res "humpedshF.Pr.hi" "UshP.Cu.hi"
## res "UshF.Pr.lo"
                         "constantP.Cu.hi" "0"
## res "UshF.Pr.lo"
                         "exponeupP.Cu.hi" "0"
## res "UshF.Pr.lo"
                         "UshP.Cu.hi"
## res "UshF.Pr.hi"
                         "constantP.Cu.hi" "0"
## res "UshF.Pr.hi"
                         "exponeupP.Cu.lo" "0"
## res "UshF.Pr.hi"
                         "exponeupP.Cu.hi"
                         "UshP.Cu.hi"
## res "UshF.Pr.hi"
                                            "0"
```

The above table is ordered by the size of the parameter space explored in which terminal investment is predicted (third column). Terminal investment occurs in 0.49 proportion of simulated conditions, overall.