#### Supplementary Mathematica file.

July 2017

#### **CONTENTS:**

Part 0: "Housekeeping", definitions of functions, matrices and replacement rules that will be used throughout the file.

Part 1: Probabilities of identity by descent (related to Appendix B2 and C2).

We compare the formulas calculated by hand to the ones obtained numerically for special structures, to check that the formulas are correct (they are).

Part 2: Expected Frequencies Functions (related to Appendix B1 and C1, and formulas in the main text)

- We simplify the formulas obtained by hand by replacing the dispersal (d) and interaction (e) graphs by their formulas in subdivided populations.
- We compare the formulas calculated by hand to the ones obtained numerically for special structures, to check that the formulas are correct (they are).
  - We export the formulas to R for further use.

#### Part 3: Changes with m

We study how the different terms of our equations (probabilities of identity by descent Q, indirect/secondary terms I, and full equations EX) change with the emigration probability m, and identify critical values.

#### Please note:

- In this file, the mutation bias is denoted by p (as in Tarnita and Taylor 2014 and Debarre 2017), instead of *v* as in the manuscript.

The letter v was chosen in the manuscript because p was sometimes mistaken by others as average frequency of altruists in the population ( $\overline{X}$  in the manuscript)... But this file was written before the change, and it is too complicated to change every instance of "p".

- Make sure to change `pathtosave` with the path to the folder containing the codes.

Before doing anything, clean the memory

In[1]:= Clear[Evaluate[Context[] <> "\*"]]

Set path to folder where outputs should be saved (otherwise it is the default Mathematica one)

In[2]:= pathtosave = "~/Documents/Work/Projects/2016\_SocEvolSubdivPop/Programs/";

# 0) Generalities - Initializations

# Some functions

Function to turn P (expected state of pairs of sites) into Q (probabilities of identity by descent)

In[3]:= PtoQ[P\_] := 
$$\frac{P - p^2}{p (1 - p)}$$
 // FullSimplify;

Delta function

 $ln[4]:= Delta[x_] := If[x == 0, 1, 0]$ 

# Define graphs for numerical evaluation

## Dispersal and Interaction Graphs

## Island model, dispersal graph, generic

N = 12, 4 demes of 3 individuals

```
In[5]:= G12generic =
```

```
dself
        din
               din
                     dout
                            dout
                                   dout
                                           dout
                                                  dout
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
 din
       dself
               din
                     dout
                            dout
                                   dout
                                           dout
                                                  dout
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
din
        din
              dself
                            dout
                                   dout
                                                         dout
                     dout
                                           dout
                                                  dout
                                                                dout
                                                                       dout
                                                                              dout
dout
       dout
              dout
                     dself
                             din
                                    din
                                           dout
                                                  dout
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
                            dself
dout
       dout
              dout
                      din
                                    din
                                           dout
                                                  dout
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
dout
       dout
              dout
                      din
                             din
                                   dself
                                          dout
                                                  dout
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
dout
       dout
              dout
                     dout
                            dout
                                   dout
                                          dself
                                                  din
                                                         din
                                                                dout
                                                                       dout
                                                                              dout
dout
       dout
              dout
                     dout
                            dout
                                   dout
                                           din
                                                 dself
                                                         din
                                                                dout
                                                                       dout
                                                                              dout
       dout
dout
              dout
                     dout
                            dout
                                   dout
                                           din
                                                  din
                                                        dself
                                                                dout
                                                                       dout
                                                                              dout
                            dout
                                                               dself
dout
       dout
              dout
                     dout
                                   dout
                                           dout
                                                  dout
                                                         dout
                                                                        din
                                                                               din
                                                                       dself
dout
       dout
              dout
                     dout
                            dout
                                   dout
                                           dout
                                                  dout
                                                         dout
                                                                din
                                                                               din
dout
                     dout
                            dout
                                                  dout
                                                         dout
                                                                        din
                                                                              dself /
              dout
                                   dout
                                           dout
```

```
Nin = 3;
Ndemes = 4;
```

N = 10, 2 demes of 5 individuals

```
din
                   dself
                            din
                                           din
                                                  din
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
                                                                                      dout
                     din
                           dself
                                   din
                                           din
                                                  din
                                                         dout
                                                                dout
                                                                       dout
                                                                              dout
                                                                                      dout
                                  dself
                     din
                                           din
                                                  din
                                                         dout
                                                                dout
                                                                       dout
                                                                                      dout
                     din
                                   din
                                         dself
                                                  din
                                                         dout
                                                                dout
                                                                       dout
                                                                                      dout
                     din
                            din
                                   din
                                          din
                                                 dself
                                                                dout
                                                                       dout
                                                                               dout
                                                                                      dout
                                                        dout
In[8]:= G10generic =
                    dout
                           dout
                                   dout
                                          dout
                                                 dout
                                                        dself
                                                                din
                                                                        din
                    dout
                           dout
                                   dout
                                          dout
                                                 dout
                                                         din
                                                               dself
                                                                        din
                                                                               din
                                                                                      din
                    dout
                           dout
                                   dout
                                          dout
                                                 dout
                                                         din
                                                                din
                                                                       dself
                                                                               din
                                                                                      din
                    dout
                           dout
                                   dout
                                          dout
                                                 dout
                                                         din
                                                                din
                                                                        din
                                                                              dself
                                                                                      din
                    dout
                           dout
                                   dout
                                          dout
                                                 dout
                                                                din
                                                                        din
                                                                               din
                                                                                     dself /
                                                         din
```

### Island model, interaction graph, generic

#### Formulas for d and e

Replacements for the generic dispersal probabilities, depending on whether there is self-replacement or not

Replacements for the generic interaction probabilities, depending on whether there is self - interaction or not

groupwithself = 
$$\left\{ \text{eself} \to 0, \text{ ein } \to \frac{1}{n-1}, \text{ eout } \to 0 \right\};$$
  
groupwithself =  $\left\{ \text{eself} \to \frac{1}{n}, \text{ ein } \to \frac{1}{n}, \text{ eout } \to 0 \right\};$ 

We can even assume that there are a proportion g of interactions outside of the group

$$\text{widewithself} = \left\{ \text{eself} \to \frac{1-g}{n}, \text{ ein} \to \frac{1-g}{n}, \text{ eout} \to \frac{g}{n \text{ d-n}} \right\};$$
 
$$\text{widenoself} = \left\{ \text{eself} \to 0, \text{ ein} \to \frac{1-g}{n-1}, \text{ eout} \to \frac{g}{n \text{ d-n}} \right\};$$

Combine these using Idself and leself, indicator variables for whether there is dispersal/interaction with self

Quick check

$$\begin{array}{ll} & \text{ln[18]:=} & \text{eself+} (n-1) \; \text{ein+} \left( n \, d-n \right) \; \text{eout/. genericde// Simplify} \\ & \text{dself+} (n-1) \; \text{din+} \left( n \, d-n \right) \; \text{dout/. genericde// Simplify} \\ & \text{Out[18]=} \; \; 1 \end{array}$$

# Probabilities of identity by descent matrices

Generic Q matrix corresponding to the populations defined above

$$N = 12$$

Out[19]= 1

```
Qin Qout Qout Qout Qout Qout Qout Qout
                             Qout Qout Qout Qout Qout Qout
                    Qin
                             Qout Qout Qout Qout Qout Qout Qout
               Qout Qout Qout
                             1
                                  Qin
                                      Qin
                                          Qout Qout Qout Qout Qout
               Qout Qout Qout
                            Qin
                                  1
                                      Qin
                                          Qout Qout Qout
                                 Qin
               Qout Qout
                        Qout Qin
                                       1
                                          Qout Qout Qout
In[20]:= 012generic =
                                                       Qout
               Qout Qout
                        Qout Qout Qout
                                          1
                                               Qin
                                                   Qin
                                 Qout Qout
                                          Qin
                        Qout Qout
                                                1
                                                    Qin
                                                        Qout
               Qout Qout Qout Qout Qin
                                               Qin
                                                        Qout
                                                            Qout
                                                    1
               Qout Qout Qout Qout Qout Qout Qout
                                                         1
                                                             Qin
                                                                 Qin
               Qout Qout Qout Qout Qout Qout Qout
                                                        Qin
                                                                 Qin
               Qout Qout Qout Qout Qout Qout Qout Qout
                                                                  1
   N = 10
                        Qin
                             Qin
                                 Qin Qout Qout Qout Qout
               Qin 1
                        Qin
                             Qin
                                 Qin
                                     Qout Qout Qout Qout
               Qin Qin
                        1
                             Qin
                                     Qout Qout Qout Qout
                                 Qin
               Qin Qin Qin
Qin Qin Qin
                             1
                                  Qin
                                     Qout Qout Qout
                                                   Qout Qout
                            Qin
                                      Qout Qout Qout
                                                   Qout Qout
                                 1
In[21]:= Q10generic =
               Qout Qout Qout Qout
                                       1
                                           Qin
                                               Qin
                                                    Qin
                                                        Qin
               Qout Qout Qout
                                 Qout
                                      Qin
                                           1
                                               Qin
                                                        Qin
               Qout Qout Qout Qout
                                      Qin
                                           Qin
                                               1
                                                        Qin
               Qout Qout Qout Qout Qin
                                          Qin
                                              Qin
                                                        Qin
                                              Qin
               Qout Qout Qout Qout Qin
                                          0in
```

# 1) Probabilities of identity by descent (Q)

# Moran

# Simplify QinM and QoutM

See Appendix B2 for calculation details on how Qself, Qin and Qout were obtained using a formula presented in the appendix of Debarre 2017 JTB for "2D graphs". Here we just copy these formulas.

$$\begin{aligned} & \text{ln[23]:=} \ \ \text{QinM2} = \frac{\mu \, \lambda}{\text{n d}} \left( \frac{1}{\mu} \, + \, \frac{1}{1 - (1 - \mu) \, \left( \text{dself-din} \right)} \, \left( -1 \right) \, + \\ & \frac{1}{1 - (1 - \mu) \, \left( 1 - \text{m} - \frac{\text{m}}{\text{d-1}} \right)} \, \left( \text{d} - 1 \right) \, + \, \frac{1}{1 - (1 - \mu) \, \left( \text{dself-din} \right)} \, \left( \text{d} - 1 \right) \, \left( -1 \right) \right); \\ & \text{QoutM2} = \frac{\mu \, \lambda}{\text{n d}} \left( \frac{1}{\mu} \, + \, \frac{1}{1 - (1 - \mu) \, \left( \text{dself-din} \right)} \, \left( -1 \right) \, + \, \frac{1}{1 - (1 - \mu) \, \left( 1 - \text{m} - \frac{\text{m}}{\text{d-1}} \right)} \, \left( -1 \right) \, + \\ & \frac{1}{1 - (1 - \mu) \, \left( \text{dself-din} \right)} \right); \end{aligned}$$

Find  $\lambda$  using Qself == 1

$$ln[25]:=$$
 the $\lambda$ M =  $\lambda$  /. Solve [QselfM2 == 1,  $\lambda$ ] [1]] // FullSimplify

$$\begin{array}{ll} \text{Out} [25] = & \left( \text{n} \left( \mathbf{1} + \text{din} + \text{dself} \left( -\mathbf{1} + \mu \right) - \text{din} \, \mu \right) \, \left( -\text{dm} + \mu + \text{d} \, \left( -\mathbf{1} + \text{m} \right) \, \mu \right) \, \right) \\ & \left( \text{m} \, \left( -\mathbf{1} + \mu \right) \, \left( \mathbf{1} + \text{din} - \text{dself} + \left( -\text{din} + \text{dself} + \text{d} \, \left( -\mathbf{1} + \text{n} \right) \, \right) \, \mu \right) + \\ & \left( -\mathbf{1} + \text{d} \right) \, \mu \, \left( -\mathbf{1} + \text{dself} + \text{din} \, \left( -\mathbf{1} + \mu \right) + \mu - \left( \text{dself} + \text{n} \right) \, \mu \right) \right) \end{aligned}$$

Replace  $\lambda$  in the equations for Qin and Qout

$$In[26]:=$$
 QinM = QinM2 /.  $\lambda \rightarrow$  the $\lambda$ M // FullSimplify QoutM = QoutM2 /.  $\lambda \rightarrow$  the $\lambda$ M // FullSimplify

$$\begin{array}{ll} \text{Out} [26] = & \Big( \left( -\mathbf{1} + \mu \right) \; \left( \left( -\mathbf{1} + \mathbf{d} \right) \; \left( \mathbf{1} + \text{din} - \text{dself} \right) \; \mu + \mathbf{m} \; \left( \mathbf{1} + \text{din} - \text{dself} - \left( \mathbf{d} + \text{din} - \text{dself} \right) \; \mu \right) \Big) \; \Big/ \\ & \left( \mathbf{m} \; \left( -\mathbf{1} + \mu \right) \; \left( \mathbf{1} + \text{din} - \text{dself} + \left( -\text{din} + \text{dself} + \mathbf{d} \; \left( -\mathbf{1} + \mathbf{n} \right) \right) \; \mu \right) \; + \\ & \left( -\mathbf{1} + \mathbf{d} \right) \; \mu \; \left( -\mathbf{1} + \text{dself} + \text{din} \; \left( -\mathbf{1} + \mu \right) \; + \mu - \left( \text{dself} + \mathbf{n} \right) \; \mu \right) \Big) \end{array}$$

$$\begin{array}{ll} \text{Out} [27] = & \left(\text{m } (-1+\mu) \; \left(1+\text{din}+\text{dself } (-1+\mu)-\text{din}\,\mu\right)\right) \left/ \\ & \left(\text{m } (-1+\mu) \; \left(1+\text{din}-\text{dself}+\left(-\text{din}+\text{dself}+\text{d}\,\left(-1+\text{n}\right)\right)\,\mu\right) + \\ & \left(-1+\text{d}\right) \; \mu \; \left(-1+\text{dself}+\text{din}\;\left(-1+\mu\right)\right. + \mu - \left(\text{dself}+\text{n}\right)\,\mu\right) \right) \end{array}$$

# Check numerically

Here we evaluate the probabilities of identity by descent numerically, using the recursion formula ("egs" in the function below), with specific graphs.

```
In[28]:= NGetQM[G_, N_, graphdegree_, p_, \mu_] := Module {QT, eqs, vars, sols, QTs}, (*
          G is the dispersal graph,
          N is the size of the population,
          graphdegree is the degree of the graph (=1 in a subdivided population),
          p is the mutation biais,
          \mu is the mutation probability.
          *)
          (* Initialize the QT matrix *)
          Do[Q_{i,j} = 0; Q_{i,j} = ., \{i, 1, N\}, \{j, 1, N\}];
          QT = Table [Q_{i,j}, \{i, 1, N\}, \{j, 1, N\}];
          Do[QT[i, i] = 1, {i, 1, N}]; (* Q_{i,i} = 1 *)
          Do[QT[i, j] = Q_{i,i}, \{j, 1, N-1\}, \{i, j+1, N\}]; (* Because Q is symmetric *)
          eqs =
           \mathsf{Flatten} \Big[ \mathsf{Table} \Big[ \mathsf{Q}_{\mathsf{i},\mathsf{j}} \ = \ \frac{(\mathsf{1} - \mu)}{2 \ \mathsf{graphdegree}} \ \Big( \mathsf{Sum} \big[ \mathsf{G} \big[ \! \big[ \mathsf{l}, \, \mathsf{j} \big] \! \big] \ \mathsf{QT} \big[ \! \big[ \mathsf{l}, \, \mathsf{i} \big] \! \big] \ \mathsf{QT} \big[ \! \big[ \mathsf{l}, \, \mathsf{j} \big] \! \big], \ \big\{ \mathsf{l}, \, \mathsf{1}, \, \mathsf{N} \big\} \big] \Big) \, ,
              \{i, 1, N-1\}, \{j, i+1, N\}];
          vars = Flatten[Table[Q_{i,j}, {i, 1, N-1}, {j, i+1, N}]];
          sols = NSolve[eqs, vars];
          QTs = QT /. sols[[1]];
          QTs|
      This function compares the numerical version to the analytical one, for specific graph structures. If the
       numerical values are the same, we are fine! (and we are, otherwise there would not be a paper)
In[29]:= prs = .;
      CheckQM[prs_, dvalues_] := Module[{NG, NQin, NQout, NQinMatrix},
          NG = ToExpression["G" <> ToString[d n /. prs] <> "generic"] /. dvalues /. prs;
          NQinMatrix = NGetQM[NG, nd/.prs, 1, 0.5, \mu/.prs];
          NQin = NQinMatrix[1, 2];
          NQout = NQinMatrix [1, n d /. prs];
          Print[{{"Qin", NQin, QinM /. dvalues /. prs},
                {"Qout", NQout, QoutM /. dvalues /. prs}} // Transpose // MatrixForm]
       Check for the population of size 12
In[31]:= CheckQM[\{m \rightarrow 0.2, d \rightarrow 4, n \rightarrow 3, \mu \rightarrow 0.2\}, withselfreplacement]
      CheckQM[\{m \rightarrow 0.2, d \rightarrow 4, n \rightarrow 3, \mu \rightarrow 0.2\}, noselfreplacement]
```

```
0.407643 0.127389
0.407643 0.127389
0.503735 0.140875
0.503735 0.140875
```

Check for the population of size 10

In[33]:= CheckQM[{m 
$$\rightarrow$$
 0.2, d  $\rightarrow$  2, n  $\rightarrow$  5,  $\mu \rightarrow$  0.2}, withselfreplacement]

CheckQM[{m  $\rightarrow$  0.2, d  $\rightarrow$  2, n  $\rightarrow$  5,  $\mu \rightarrow$  0.2}, noselfreplacement]

$$\begin{pmatrix} \text{Qin} & \text{Qout} \\ 0.329897 & 0.206186 \\ 0.329897 & 0.206186 \end{pmatrix}$$

$$\begin{pmatrix} \text{Qin} & \text{Qout} \\ 0.3762 & 0.222649 \\ 0.3762 & 0.222649 \end{pmatrix}$$

#### Particular cases

# Equations with self replacement (dself = din)

In[35]:= QinMs = QinM /. withselfreplacement // FullSimplify QoutMs = QoutM /. withselfreplacement // FullSimplify

$$\text{Out} [\text{35}] = -\frac{\left(-1+\mu\right) \left(\mu-d\;\mu+m\;\left(-1+d\;\mu\right)\right)}{-\left(-1+d\right)\;\mu\;\left(1+\left(-1+n\right)\;\mu\right) + m\;\left(-1+\mu\right)\;\left(1+d\;\left(-1+n\right)\;\mu\right)}$$

$$\text{Out} [36] = \frac{ \text{m } (-1 + \mu) }{ - \left(-1 + d\right) \; \mu \; \left(1 + \left(-1 + n\right) \; \mu\right) \; + \text{m } \; \left(-1 + \mu\right) \; \left(1 + d \; \left(-1 + n\right) \; \mu\right) }$$

Simplify the way the equations are written (human - friendly versions), and check that the formulas remain correct

Out[37]= 0

$$\ln[38] := \text{QoutMs} - (\text{m} (1 - \mu)) / ((d - 1) \mu (1 + (n - 1) \mu) + \text{m} (1 - \mu) (1 + d (n - 1) \mu)) // \text{FullSimplify}$$

$$\text{Out[38]} = 0$$

Check limit behavior:

First infinite population, then zero mutation

VS.

First zero mutation, then infinite population

$$\label{eq:limit_point} $$ \underset{\text{Limit}[\text{QoutMs, d} \to \infty]}{\text{Msimplify}}$$ $$ \underset{\text{Limit}[\text{QoutMs, $\mu \to 0], d} \to \infty]}{\text{Msimplify}} $$ $$ $$ // \text{FullSimplify}$$$$

Out[39]= 0

Out[40]= 1

$$In[41]:=$$
 Limit[QinMs, d  $\rightarrow \infty$ ] // FullSimplify % /.  $\mu \rightarrow 0$  // FullSimplify

$$\begin{array}{c} \text{Out}[41] = \end{array} \ \frac{-\ \mathbf{1} + \mathbf{m} + \mu - \mathbf{m} \ \mu}{-\ \mathbf{1} + \mathbf{m} \ \left( -\ \mathbf{1} + \mathbf{n} \right) \ \left( -\ \mathbf{1} + \mu \right) \ + \mu - \mathbf{n} \ \mu} \end{array}$$

Out[42]= 
$$\frac{1-m}{1+m(-1+n)}$$

$$_{\text{In}[43]:=}$$
 Limit[QinMs,  $\mu \rightarrow 0$ ]  
Limit[%, d  $\rightarrow \infty$ ] // FullSimplify

Out[43]= 1

Out[44]= 1

In[45]:= Series[QinMs, 
$$\{\mu, 0, 1\}$$
]

Out[45]= 
$$1 - d n \mu + 0 [\mu]^2$$

### Equations without Self - replacement (dself = 0)

Out[47]= 
$$(m (n + m (-1 + \mu) - \mu) (-1 + \mu)) / (m^2 (-1 + \mu)^2 - (-1 + d) n \mu (1 + (-2 + n) \mu) + m n (-1 + \mu) (1 + d (-2 + n) \mu))$$

Simplify the way they are written

$$\begin{array}{l} & \text{ln}[48] = & \text{QinMw} - \left( \left( 1 - \mu \right) \; \left( d \; n \; \mu \; \left( 1 - m \right) \; + \; \left( m - \mu \right) \; n - m^2 \; \left( 1 - \mu \right) \; \right) \right) \; / \\ & \left( + \; \left( d - 1 \right) \; n \; \mu \; \left( 1 + \; \left( n - 2 \right) \; \mu \right) \; + \; m \; n \; \left( 1 - \mu \right) \; \left( 1 + \; d \; \left( n - 2 \right) \; \mu \right) \; - \; m^2 \; \left( 1 - \mu \right)^2 \right) \; / / \; \text{FullSimplify} \end{array}$$

Out[48]= 0

$$\begin{array}{ll} & \text{In}[49] := & \text{QoutMw} - \left(\text{m} \left(\text{n} + \text{m} \left(-1 + \mu\right) - \mu\right) \left(1 - \mu\right)\right) \left/ \left(1 + \left(\text{d} - 1\right) \,\text{n} \,\mu \,\left(1 + \left(\text{n} - 2\right) \,\mu\right) + \text{m} \,\text{n} \,\left(1 - \mu\right) \,\left(1 + \text{d} \,\left(\text{n} - 2\right) \,\mu\right) - \text{m}^2 \,\left(1 - \mu\right)^2\right) \, / / \,\, \text{FullSimplify} \end{array}$$

Out[49]= **0** 

Limit behavior

$$_{\text{In}[50]:=}$$
 Limit[QinMw, d  $\rightarrow \infty$ ] // FullSimplify Limit[%,  $\mu \rightarrow 0$ ] // FullSimplify

$$\text{Out[50]= } \frac{ -1 + m + \mu - m \, \mu }{ -1 + m \, \left( -2 + n \right) \, \left( -1 + \mu \right) \, - \, \left( -2 + n \right) \, \mu }$$

$$\mathsf{Out}[51] = \ \frac{1-m}{1+m\ (-2+n)}$$

$$\ln[52]:=$$
 Limit [QoutMw,  $d \to \infty$ ]
Limit [QoutMw,  $\mu \to 0$ ]

Out[52]= 0

Out[53]= 1

# Wright - Fisher

The structure of this part is the same as for the Moran version above, so comments are lighter here.

## Simplify QinM and QoutM

See Appendix B2 for details on how Qself, Qin and Qout were obtained using a formula presented in the appendix of Debarre 2017 JTB for "2D graphs".

$$\frac{\mu \lambda}{\text{n d}} \left( \frac{1}{1 - (1 - \mu)^2} + \frac{1}{1 - (1 - \mu)^2 \left( \text{dself-din} \right)^2} \right) \left( \text{n-1} \right) d + \frac{1}{1 - (1 - \mu)^2 \left( 1 - \text{m} - \frac{\text{m}}{\text{d-1}} \right)^2} \left( \text{d-1} \right) \right);$$

$$QinWF2 = \frac{\mu \lambda}{n d} \left( \frac{1}{1 - (1 - \mu)^2} - \frac{1}{1 - (1 - \mu)^2 \left( dself - din \right)^2} d + \frac{1}{1 - (1 - \mu)^2 \left( 1 - m - \frac{m}{d-1} \right)^2} (d-1) \right);$$

QoutWF2 = 
$$\frac{\mu \lambda}{n d} \left( \frac{1}{1 - (1 - \mu)^2} - \frac{1}{1 - (1 - \mu)^2 (1 - m - \frac{m}{d-1})^2} \right);$$

Find  $\lambda$  using Qself == 1

$$ln[57] = \lambda WF = \lambda /. Solve[QselfWF2 == 1, \lambda][[1]]$$

$$\text{Out[57]=} \quad \frac{\text{d n}}{\left(\frac{1}{1-\left(1-\mu\right)^{2}}+\frac{\text{d }\left(-1+n\right)}{1-\left(-\text{din+dself}\right)^{2}\left(1-\mu\right)^{2}}+\frac{-1+\text{d}}{1-\left(1-\text{m}-\frac{\text{m}}{-1+\text{d}}\right)^{2}\left(1-\mu\right)^{2}}\right)\,\mu} \right) }$$

Replace  $\lambda$  in the equations

$$In[58]:=$$
 QinWF = QinWF2 /.  $\lambda \to \lambda$ WF // FullSimplify QoutWF = QoutWF2 /.  $\lambda \to \lambda$ WF // FullSimplify

$$\text{Out}[58] = \begin{array}{c} -\frac{d}{1-\left(\text{din-dself}\right)^2 \, \left(-1+\mu\right)^2} \, + \, \frac{-1+d}{1-\frac{(1+d\, (-1+\mu))^2}{(-1+d)^2}} \, + \, \frac{1}{2\, \mu-\mu^2} \\ \frac{d\, \left(-1+n\right)}{1-\left(\text{din-dself}\right)^2 \, \left(-1+\mu\right)^2} \, + \, \frac{-1+d}{1-\frac{(1+d\, (-1+\mu))^2}{(-1+d)^2}} \, + \, \frac{1}{2\, \mu-\mu^2} \end{array}$$

$$\text{Out[59]=} \begin{array}{c} -\frac{1}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{1}{2\mu-\mu^2} \\ \frac{d(-1+n)}{1-\left(\text{din-dself}\right)^2(-1+\mu)^2} + \frac{-1+d}{1-\frac{(1+d)(-1+\mu))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{1}{2\mu-\mu^2} \end{array}$$

# Check numerically

```
In[60]:= NGetQWF[G_, N_, graphdegree_, p_, \mu_] := Module[{QT, eqs, vars, sols, QTs}, (*
          G is the dispersal graph,
          N is the size of the population,
          graphdegree is the degree of the graph (=1 in a subdivided pop),
          p is the mutation biais,
          \mu is the mutation probability.
          *)
           (* Initialize the QT matrix *)
          Do[Q_{i,j} = 0; Q_{i,j} = ., \{i, 1, N\}, \{j, 1, N\}];
          QT = Table [Q_{i,j}, \{i, 1, N\}, \{j, 1, N\}];
          Do[QT[i, i] = 1, {i, 1, N}]; (* Q_{i,i}=1 *)
          Do[QT[i,j] = Q_{j,i}, \{j,1,N-1\}, \{i,j+1,N\}]; (* Because Q is symmetric *)
          eqs =
            \mathsf{Flatten} \Big[ \mathsf{Table} \Big[ \mathsf{Q}_{\mathsf{i},\mathsf{j}} = \frac{(\mathsf{1} - \mu)^2}{\mathsf{graphdegree}^2} \, \big( \mathsf{Sum} \big[ \mathsf{G} \big[ \mathsf{l}, \, \mathsf{j} \big] \, \mathsf{G} \big[ \mathsf{k}, \, \mathsf{i} \big] \, \mathsf{QT} \big[ \mathsf{k}, \, \mathsf{l} \big], \, \big\{ \mathsf{l}, \, \mathsf{1}, \, \mathsf{N} \big\}, \, \big\{ \mathsf{k}, \, \mathsf{1}, \, \mathsf{N} \big\} \big] \big) \,,
               \{i, 1, N-1\}, \{j, i+1, N\}];
          vars = Flatten[Table[Q_{i,j}, {i, 1, N-1}, {j, i+1, N}]];
          sols = NSolve[eqs, vars];
          QTs = QT /. sols[[1]];
          QTs
In[61]:= prs = .;
       CheckQWF[prs_, dvalues_] := Module[{NG, NQin, NQout, NQinMatrix},
          NG = ToExpression["G" <> ToString[d n /. prs] <> "generic"] /. dvalues /. prs;
          NQinMatrix = NGetQWF[NG, nd/.prs, 1, 0.5, \mu/.prs];
          NQin = NQinMatrix[1, 2];
          NQout = NQinMatrix [1, n d /. prs];
          Print[{{"Qin", NQin, QinWF /. dvalues /. prs},
                 {"Qout", NQout, QoutWF /. dvalues /. prs}} // Transpose // MatrixForm]
         1
In[63]:= CheckQWF[\{m \rightarrow 0.2, d \rightarrow 4, n \rightarrow 3, \mu \rightarrow 0.2\}, withselfreplacement]
       CheckQWF[\{m \rightarrow 0.2, d \rightarrow 4, n \rightarrow 3, \mu \rightarrow 0.2\}, noselfreplacement]
       CheckQWF[\{m \rightarrow 0.2, d \rightarrow 2, n \rightarrow 5, \mu \rightarrow 0.2\}, withselfreplacement]
       CheckQWF[\{m \rightarrow 0.2, d \rightarrow 2, n \rightarrow 5, \mu \rightarrow 0.2\}, noselfreplacement]
```

#### Particular cases

### With Self Replacement

In[67]:= QinWFs = QinWF /. withselfreplacement // FullSimplify

$$\text{Out[67]=} \begin{array}{c} -d + \frac{-1 + d}{1 - \frac{(1 + d \ (-1 + m))^2 \ (-1 + \mu)^2}{(-1 + d)^2}} + \frac{1}{2 \ \mu - \mu^2} \\ d \ \left(-1 + n\right) + \frac{-1 + d}{1 - \frac{(1 + d \ (-1 + m))^2 \ (-1 + \mu)^2}{(-1 + d)^2}} + \frac{1}{2 \ \mu - \mu^2} \end{array}$$

Simplify the way it is written

In[68]:= M1 = 
$$\frac{-1 + d}{1 - \frac{(1+d(-1+m))^2(-1+\mu)^2}{(-1+d)^2}};$$
M2 = 
$$\frac{1}{2\mu - \mu^2};$$

qinwfs = 
$$\frac{-d + M1 + M2}{(n-1) d + M1 + M2}$$
;  
QinWFs - qinwfs // FullSimplify

Out[71]= **0** 

In[72]:= QoutWFs = QoutWF /. withselfreplacement // FullSimplify

$$\text{Out} [72] = \begin{array}{c} -\frac{1}{1-\frac{(1+d\ (-1+m))^2\ (-1+\mu)^2}{(-1+d)^2}} + \frac{1}{2\ \mu - \mu^2} \\ \hline d\ (-1+n) + \frac{-1+d}{1-\frac{(1+d)^2\ (-1+\mu)^2\ (-1+\mu)^2}{(-1+d)^2}} + \frac{1}{2\ \mu - \mu^2} \end{array}$$

Simplify the way it is written

$$\label{eq:local_local_local_local_local} \begin{split} & \ln[73] \coloneqq \text{ qoutwfs} = \frac{\frac{-1}{d-1} \, \text{M1} + \text{M2}}{d \, \left( n-1 \right) \, + \, \text{M1} + \, \text{M2}} \, \, / / \, \, \text{FullSimplify}; \\ & \text{qoutwfs} - \text{QoutWFs} \, / / \, \, \text{FullSimplify} \end{split}$$

Out[74]= 0

Limit behavior

$$In[75]:=$$
 Limit[QinWFs,  $\mu \rightarrow 0$ ]  
Limit[QoutWFs,  $\mu \rightarrow 0$ ]

Out[75]= 1

Out[76]= 1

ln[77]:= Limit[QinWFs, d  $\rightarrow \infty$ ] // FullSimplify Limit[%,  $\mu \rightarrow 0$ ] // FullSimplify

$$\begin{aligned} & \text{Out}[77] = & -\left(\left(\left(-1+m\right)^2 \left(-1+\mu\right)^2\right) \middle/ \left(-1-2\,m\,\left(-1+n\right)\,\left(-1+\mu\right)^2+m^2\,\left(-1+n\right)\,\left(-1+\mu\right)^2+\left(-1+n\right)\,\left(-2+\mu\right)\,\mu\right) \right) \\ & \text{Out}[78] = & -\frac{\left(-1+m\right)^2}{-1+\left(-2+m\right)\,m\,\left(-1+n\right)} \end{aligned}$$

ln[79]:= Limit[QoutWFs, d  $\rightarrow \infty$ ] // FullSimplify

Out[79]= 0

## Comparison to Cockerham and Weir 1987

Cockerham and Weir's  $\beta$ 

In[80]:= 
$$dd = \left(1 - m \frac{nbdemes}{nbdemes - 1}\right)^2$$
;  
 $\rho = (1 - \mu)^2$ ;

Update deme size, which is 2 N in their paper, to N, to adapt the result to a haploid population

$$In[82]:= \beta = \rho dd / (demesize (1 - \rho dd) + \rho dd) // FullSimplify  $\rho = .; dd = .;$$$

$$\text{Out} [82] = \left( \left( 1 + (-1 + m) \text{ nbdemes} \right)^2 (-1 + \mu)^2 \right) / \left( \left( -1 + \text{nbdemes} \right)^2 \right) \\ \left( \text{demesize } \left( 1 - \frac{\left( 1 + (-1 + m) \text{ nbdemes} \right)^2 (-1 + \mu)^2}{\left( -1 + \text{nbdemes} \right)^2} \right) + \frac{\left( 1 + (-1 + m) \text{ nbdemes} \right)^2 (-1 + \mu)^2}{\left( -1 + \text{nbdemes} \right)^2} \right) \right)$$

For us:

$$ln[84]:= my\beta = \frac{QinWF - QoutWF}{1 - QoutWF}$$
 // FullSimplify

$$\begin{array}{l} \text{Out} \text{[84]=} & \left( \left( \left( -1 + d \right)^2 \left( -1 + \left( \text{din} - \text{dself} \right)^2 \right) + 2 \left( -1 + d \right) \, \text{d} \, \text{m} - \text{d}^2 \, \text{m}^2 \right) \, \left( -1 + \mu \right)^2 \right) / \\ & \left( -1 + \left( \text{din} - \text{dself} \right)^2 + 2 \, \mu - 2 \, \left( \left( \text{din} - \text{dself} \right)^2 + n \right) \, \mu + \left( -1 + \left( \text{din} - \text{dself} \right)^2 + n \right) \, \mu^2 + \right. \\ & \left. \left( \left( \text{din} - \text{dself} \right)^2 + \left( -2 + m \right) \, \text{m} \, \left( -1 + n \right) + 2 \, \mu - 2 \, \left( \left( \text{din} - \text{dself} \right)^2 + \left( -2 + m \right) \, \text{m} \, \left( -1 + n \right) + n \right) \, \mu + \right. \\ & \left. \left( \left( \text{din} - \text{dself} \right)^2 + \left( -1 + m \right)^2 \, \left( -1 + n \right) \right) \, \mu^2 \right) + 2 \, d \, \left( 1 - \left( \text{din} - \text{dself} \right)^2 - m + m \, n + 2 \, \left( -1 + \left( \text{din} - \text{dself} \right)^2 + m + n - m \, n \right) \, \mu - \left( -1 + \left( \text{din} - \text{dself} \right)^2 + m + n - m \, n \right) \, \mu^2 \right) \right) \end{array}$$

Compare the two -> same!

$$\text{In}_{[85]:=} \ \ \, \text{my}\beta - \beta \ / \cdot \ \, \left\{ \text{nbdemes} \to d \, , \, \text{demesize} \to n \right\} \ / / \ \, \text{FullSimplify}$$

$$\text{Out}_{[85]=} \ \, \left( -1 + \mu \right)^2 \ \, \left( -\left( \left( 1 + d \, \left( -1 + m \right) \right)^2 \right) \right)$$

$$\left( \left( -1 + d \right)^2 \ \, \left( n \, \left( 1 - \frac{\left( 1 + d \, \left( -1 + m \right) \right)^2 \left( -1 + \mu \right)^2}{2} \right) + \frac{\left( 1 + d \, \left( -1 + m \right) \right)^2 \left( -1 + \mu \right)}{2} \right) \right)$$

$$\left( \left( -1 + d \right)^2 \left( n \left( 1 - \frac{\left( 1 + d \left( -1 + m \right) \right)^2 \left( -1 + \mu \right)^2}{\left( -1 + d \right)^2} \right) + \frac{\left( 1 + d \left( -1 + m \right) \right)^2 \left( -1 + \mu \right)^2}{\left( -1 + d \right)^2} \right) \right) \right) + \\ \left( \left( -1 + d \right)^2 \left( -1 + \left( din - dself \right)^2 \right) + 2 \left( -1 + d \right) d m - d^2 m^2 \right) / \\ \left( -1 + \left( din - dself \right)^2 + 2 \mu - 2 \left( \left( din - dself \right)^2 + n \right) \mu + \\ \left( -1 + \left( din - dself \right)^2 + n \right) \mu^2 + d^2 \left( -1 + \left( din - dself \right)^2 + \left( -2 + m \right) m \left( -1 + n \right) + 2 \mu - \\ 2 \left( \left( din - dself \right)^2 + \left( -2 + m \right) m \left( -1 + n \right) + n \right) \mu + \left( \left( din - dself \right)^2 + \left( -1 + m \right)^2 \left( -1 + n \right) \right) \mu^2 \right) + \\ 2 d \left( 1 - \left( din - dself \right)^2 - m + m n + 2 \left( -1 + \left( din - dself \right)^2 + m + n - m n \right) \mu - \\ \left( -1 + \left( din - dself \right)^2 + m + n - m n \right) \mu^2 \right) \right)$$

 $In[86]:= \beta = .; my\beta = .;$ 

### Without Self Replacement

In[87]:= QinWFw = QinWF /. noselfreplacement // FullSimplify

$$\text{Out}[87] = \begin{array}{c} \frac{-1 + d}{1 - \frac{\left(1 + d \left(-1 + m\right)\right)^2 \left(-1 + \mu\right)^2}{\left(-1 + d\right)^2}} - \frac{d}{1 - \frac{\left(-1 + m\right)^2 \left(-1 + \mu\right)^2}{\left(-1 + m\right)^2}} + \frac{1}{2 \, \mu - \mu^2} \\ \frac{-1 + d}{1 - \frac{\left(1 + d \left(-1 + m\right)\right)^2 \left(-1 + \mu\right)^2}{\left(-1 + d\right)^2}} + \frac{d \left(-1 + n\right)}{1 - \frac{\left(-1 + m\right)^2 \left(-1 + \mu\right)^2}{\left(-1 + n\right)^2}} + \frac{1}{2 \, \mu - \mu^2} \end{array}$$

In[88]:= QoutWFw = QoutWF /. noselfreplacement // FullSimplify

$$\text{Out[88]=} \begin{array}{c} -\frac{1}{1-\frac{(1+d)(-1+m))^2}{(-1+d)^2}} + \frac{1}{2\mu-\mu^2} \\ \frac{-1+d}{1-\frac{(1+d)(-1+m))^2}{(-1+d)^2}} + \frac{d(-1+n)}{1-\frac{(-1+m)^2}{(-1+n)^2}} + \frac{1}{2\mu-\mu^2} \end{array}$$

# Export to R the Q results

Rewrite the Greek letters

In[89]:= GreekTerms = 
$$\{\omega \rightarrow \text{sel}, \mu \rightarrow \text{mut}\}$$
Out[89]:=  $\{\omega \rightarrow \text{sel}, \mu \rightarrow \text{mut}\}$ 

Common parts to all functions

```
In[90]:= FunctionPartB = " <- function(p, sel, mut, m, g, n, d, Idself, Ieself) {</pre>
     ## Arguments:
     # p
            mutation bias
     # sel intensity of selection
     # mut mutation probability
            emigration probability
     # m
            proportion of
         interactions out of the group (interaction equivalent of m)
            deme size
     # n
            number of demes
     # Idself whether reproduction in site where the parent is
     # Ieself whether interactions with oneself
     return(
     ";
     FunctionPartE = ")
     }";
     Function to translate Mathematica to R
In[92]:= ToRForm[x_] := ToString[x /. GreekTerms // CForm]
     Do it for Q
In[93]:= RtxtQinM =
       "QinM " <> FunctionPartB <> ToRForm[QinM /. genericde // FullSimplify] <> FunctionPartE;
     RtxtQoutM = "QoutM " <> FunctionPartB <>
        ToRForm[QoutM /. genericde // FullSimplify] <> FunctionPartE;
     RtxtQinWF = "QinWF " <> FunctionPartB <>
        ToRForm[QinWF /. genericde // FullSimplify] <> FunctionPartE;
     RtxtQoutWF = "QoutWF " <> FunctionPartB <>
        ToRForm[QoutWF /. genericde // FullSimplify] <> FunctionPartE;
     Define Power function in R
In[97]:= PowerDef = "Power <- function(a,b) return(a^b)";</pre>
     Combine all texts
In[98]:= Rtxt = PowerDef <> "
     " <> RtxtQinM <> "
     " <> RtxtQoutM <> "
     " <> RtxtQinWF <> "
     " <> RtxtQoutWF;
     Export to txt file (Mathematica did not want R)
In[99]:= Export[pathtosave <> "Mathematica/analyticsQ.txt", Rtxt];
```

#### Convert the file extension to R

```
In[100]:= cmd = "mv " <> pathtosave <>
         "Mathematica/analyticsQ.txt "<> pathtosave <> "Mathematica/analyticsQ.R";
In[101]:= Get["!"<> cmd]
```

# 2) Expected Frequency Equations

# Formulas for the different life-cycles

The formulas for each term is obtained by hand, by replacing the dispersal and interaction graphs by their formulas in a subdivided population, from the equations given in Appendix B1. In some cases (e.g.,  $\beta$ I for the Moran DB life-cycle), there is a large number of cases to consider when unpacking the sums. D corresponds to direct / primary effects,

I corresponds to indirect / secondary effects.

#### Moran, Birth-Death

```
β
ln[102] = \beta BDD = (1 - \mu)  (eself + (n - 1) ein Qin + (n d - n) eout Qout);
ln[103] = \beta BDI = dselfeself + (n-1) dinein + (nd - n) douteout(*)
            *) + (n-1) (dineself + dselfein + (n-2) dinein + (nd - n) dout eout) Qin (*
            *) + (nd - n) (dself eout + (n-1) din eout +
                dout eself + (n-1) dout ein + (n d - 2 n) dout eout) Qout (*
            *) -\frac{\mu}{n d} (1 + (n-1) Qin + (n d - n) Qout) (eself + (n-1) ein + (n d - n) eout);
ln[104] = factorBD = \frac{p (1-p)}{\mu}
Out[104]= (1 - p) p
In[105] := \beta BD = factor BD (\beta BDD - \beta BDI);
        γ
In[106]:= \gamma BDD = 1 - \mu;
ln[107]:= \gamma BDI = dself + (n-1) din Qin + (n d - n) dout Qout - \frac{\mu}{n d} (1 + (n-1) Qin + (n d - n) Qout);
```

```
In[108]:= \gammaBD = factorBD (\gammaBDD - \gammaBDI) // FullSimplify
Out[108] = \frac{1}{d n \mu} (-1 + p) p \left(d n \left(-1 + dself + din \left(-1 + n\right) Qin + \left(-1 + d\right) dout n Qout\right) + \frac{1}{d n \mu} \left(-1 + p\right) \left(-1
                                                                                                                                                                                                                                        (-1 + Qin + n (d - Qin + Qout - d Qout)) \mu
```

#### Moran, Death-Birth

β

```
In[109]:= \beta DBD = \beta BDD
Out[109]= (eself + ein (-1 + n) Qin + eout (-n + dn) Qout) (1 - \mu)
ln[110] = \beta DBI = (1 - \mu) (1 * dself dself eself * 1 (*)
             02*) + (n - 1) dself din ein * 1(*
             03*) + (nd - n) dself dout eout *1(*)
             04*) + (n - 1) dself dself ein Qin(*
             05*) + (n - 1) dself din eself Qin(*
             06*) + (n - 1) (n - 2) dself din ein Qin(*
             07*) + (n-1) (nd-n) dself dout eout Qin(*)
             08*) + (nd - n) dself dself eout Qout(*
             09*) + (nd - n) (n - 1) dself din eout Qout(*)
             10*) + (n d - n) dself dout eself Qout (*
             11*) + (nd - n) (n - 1) dself dout ein Qout(*)
             12*) + (nd - n) (nd - 2n) dself dout eout Qout (*)
             13*) + (n - 1) din dself eself Qin(*
             14*) + (n - 1) din din ein Qin(*
             15*) + (n-1) (n-2) din din ein Qin (*)
             16*) + (n-1) (nd - n) din dout eout Qin(*)
             17*) + (n - 1) din dself ein (*
             18*) + (n - 1) din din eself(*
             19*) + (n-1) (n-2) din din ein(*
             20*) + (n-1) (nd-n) din dout eout(*
             21*) + (n - 1) (n - 2) din dself ein Qin(*
             22*) + (n-1) (n-2) din din ein Qin(*
             23*) + (n-1) (n-2) din din eself Qin(*
             24*) + (n-1) (n-2) (n-3) din din ein Qin (*)
             25*) + (n-1) (n-2) (nd-n) din dout eout Qin (*)
             26*) + (n-1) (nd-n) din dself eout Qout(*)
             27*) + (n-1) (nd-n) din din eout Qout(*)
             (28*) + (n-1) (nd-n) (n-2) din din eout Qout (*)
             29*) + (n-1) (nd-n) din dout eself Qout(*)
             30*) + (n-1) (n d - n) (n-1) din dout ein Qout(*)
             31*) + (n-1) (nd-n) (nd-2n) din dout eout Qout(*)
             32*) + (n d - n) dout dself eself Qout (*
```

```
34*) + (n d - n) dout dout eout Qout(*
              35*) + (nd - n) (n - 1) dout dout eout Qout (*)
              36*) + (nd - n) (nd - 2n) dout dout eout Qout (*)
              37*) + (nd - n) (n - 1) dout dself ein Qout (*)
              38*) + (nd - n) (n - 1) dout din eself Qout (*)
              39*) + (nd - n) (n - 1) (n - 2) dout din ein Qout (*)
              40*) + (nd - n) (n - 1) dout dout eout Qout (*)
              41*) + (nd - n) (n - 1) (n - 1) dout dout eout Qout (*
              42*) + (nd - n) (n - 1) (nd - 2n) dout dout eout Qout(*
              43*) + (nd - n) dout dself eout (*)
              44*) + (nd - n) (n - 1) dout din eout(*
              45*) + (nd - n) dout dout eself(*
              46*) + (nd - n) (n - 1) dout dout ein(*)
              47*) + (nd - n) (nd - 2n) dout dout eout (*)
              48*) + (nd - n) (n - 1) dout dself eout Qin(*)
              49*) + (nd - n) (n - 1) (n - 1) dout din eout Qin (*)
              50*) + (nd - n) (n - 1) dout dout ein Qin(*)
              51*) + (nd - n) (n - 1) dout dout eself Qin(*)
              52*) + (nd - n) (n - 1) (n - 2) dout dout ein Qin (*)
              53*) + (nd - n) (n - 1) (nd - 2n) dout dout eout Qin(*)
              54*) + (nd - n) (nd - 2n) dout dself eout Qout (*
              55*) + (nd-n) (nd-2n) (n-1) dout din eout Qout (*
              56*) + (nd - n) (nd - 2n) dout dout eout Qout (*
              57*) + (nd - n) (nd - 2n) (n - 1) dout dout eout Qout(*
              58*) + (nd - n) (nd - 2n) dout dout eself Qout (*
              59*) + (nd-n) (nd-2n) (n-1) dout dout ein Qout(*
              60*) + (nd - n) (nd - 2n) (nd - 3n) dout dout eout Qout);
In[111]:= factorDB = factorBD
\mathsf{Out}[\mathsf{111}] = \begin{array}{c} \underline{(1-p) \ p} \end{array}
ln[112]:= \beta DB = factorDB (\beta DBD - \beta DBI) // FullSimplify
Out[112]= \frac{1}{\mu} (1-p) p (eself + ein (-1 + n) Qin + (-1 + d) eout n Qout -
           dself^{2} (eself + ein (-1 + n) Qin + (-1 + d) eout n Qout) - din<sup>2</sup> (-1 + n) (eself +
               eself (-2+n) Qin + ein (-2+n+(3+(-3+n) n) Qin) + (-1+d) eout (-1+n) n Qout) -
           (-1+d) dout<sup>2</sup> n ( (eself + ein (-1+n) + (-2+d) eout n) (1+ (-1+n) Qin) +
               n((-2+d) \text{ eself} + (-2+d) \text{ ein } (-1+n) + (3+(-3+d) d) \text{ eout } n) \text{ Qout}) - 2(-1+d) \text{ dout}
            dselfn(eself+ein(-1+n))Qout+eout(1+(-1+n)Qin+(-2+d)nQout))
           2 din (-1+n) (dself (ein + eself Qin + ein (-2+n) Qin + (-1+d) eout n Qout) + (-1+d)
                 dout n (eout + eout (-1+n) Qin + (eself + ein (-1+n) + (-2+d) eout n) Qout))) (1-\mu)
```

33\*) + (nd - n) (n - 1) dout din ein Qout(\*)

# Wright - Fisher

The formulas are the same as the Moran DB life-cycle, only the probabilities of identity by descent Q will differ.

```
β
```

```
In[116]:= βWFI = βDBI;
βWFD = βDBD;
βWF = βDB;

/
In[119]:= γWF = γDB;
γWFD = γDBD;
γWFI = γDBI;
```

# Check the results numerically

We use generic equations valid for any life-cycle and any graph, and adapt them to our life-cycles and to a subdivided population. We compare the numerical results to the ones obtained with the equations written above.

# Full functions, any life-cycle

 $\beta$  and  $\gamma$  were calculated by hand - these are generic equations value for any life-cycle and any regular graph.

(see Appendix B1 for details, and Debarre 2017 JTB for even further details)

```
In[122]:= GetBeta[sBf_, Df_, G_, GE_, Qmat_, N_, graphdegree_, Bstar_] :=
                               Module [{part1, part2, factor},
                                    factor = \frac{p(1-p)}{\mu \text{ N Bstar}};
                                    part1 = Sum[((1-\mu) \text{ sBf}[G, N, \text{graphdegree}, j, l] - Df[G, N, \text{graphdegree}, j, l]) *
                                                   GE[[k, l] * Qmat[[j, k]], {j, 1, n}, {k, 1, n}, {l, 1, n}];
                                     factor * part1
                           GetGamma[sBf_, Df_, G_, GE_, Qmat_, N_, graphdegree_, Bstar_] :=
                                Module {part1, part2, factor},
                                    factor = \frac{p(1-p)}{\mu \text{ N Bstar}};
                                    part1 = Sum[((1 - \mu) \text{ sBf}[G, N, \text{ graphdegree}, j, k] - \text{Df}[G, N, \text{ graphdegree}, j, k]) *
                                                   Qmat[[j, k]], \{j, 1, N\}, \{k, 1, N\}];
                                     factor *
                                         part1
               Moran DB
                            Define \delta B and \delta D
                          graphdegree is the degree of the graph, here equal to 1
  In[124]:= sBfDB[G_, N_, graphdegree_, j_, k_] :=
                                      (Delta[k-j] graphdegree<sup>2</sup> - Sum[G[j, i] G[k, i], \{i, 1, n\}]) / (N graphdegree<sup>2</sup>);
                          DfDB[G_, N_, graphdegree_, j_, k_] := 0;
                          BstarDB = \frac{1}{N};
                           β
                           Numerical comparison for the population of size 12
   In[127]:= βDBexemple = GetBeta[sBfDB, DfDB, G12generic,
                                         GE12generic, Q12generic, 12, 1, BstarDB /. N \rightarrow 12 // FullSimplify
\mathsf{Out}[127] = -\frac{1}{\mu} \left(-1 + \mathsf{p}\right) \; \mathsf{p} \; \left( \left(-1 + \mathsf{dself}^2\right) \; \left(\mathsf{eself} + 2 \; \mathsf{ein} \; \mathsf{Qin} + 9 \; \mathsf{eout} \; \mathsf{Qout}\right) \; + \right) \; \mathsf{p} \; \left( \left(-1 + \mathsf{dself}^2\right) \; \left(-1 + \mathsf{p}\right) \; \mathsf{p} \; \mathsf{p
                                               2 din<sup>2</sup> (ein + eself + 3 ein Qin + eself Qin + 18 eout Qout) +
                                              18 dout dself (eout + 2 eout Qin + 2 ein Qout + 6 eout Qout + eself Qout) +
                                              9 \text{ dout}^2 (2 \text{ ein} + 6 \text{ eout} + \text{ eself}) (1 + 2 \text{ Qin}) + 3 (4 \text{ ein} + 21 \text{ eout} + 2 \text{ eself}) \text{ Qout} +
                                              4 din (dself (ein + (ein + eself) Qin + 9 eout Qout) +
                                                              9 dout (eout + 2 eout Qin + 2 ein Qout + 6 eout Qout + eself Qout))) (-1 + \mu)
```

In[128]:=  $\beta$ DBexemple -  $\beta$ DB /.  $\{n \rightarrow 3, d \rightarrow 4\}$  // FullSimplify

Out[128]= 0

The difference is zero: we are fine!

Numerical comparison for the population of size 10

In[129]:= βDBexemple2 = GetBeta[sBfDB, DfDB, G10generic,

GE10generic, Q10generic, 10, 1, BstarDB /. N → 10] // FullSimplify

$$\begin{aligned} & \text{Out} \text{[129]=} & -\frac{1}{\mu} \left(-1+p\right) \text{ p } \left(\left(-1+\text{dself}^2\right) \left(\text{eself}+4 \text{ ein Qin}+5 \text{ eout Qout}\right) + \right. \\ & \left. 4 \text{ din}^2 \left(\text{eself}+3 \text{ eself Qin}+\text{ein } \left(3+13 \text{ Qin}\right)+20 \text{ eout Qout}\right) + \right. \\ & \left. 5 \text{ dout}^2 \left(\left(4 \text{ ein}+\text{eself}\right) \left(1+4 \text{ Qin}\right)+25 \text{ eout Qout}\right) + \right. \\ & \left. 10 \text{ dout dself } \left(\text{eout}+4 \text{ eout Qin}+\left(4 \text{ ein}+\text{eself}\right) \text{ Qout}\right) + \right. \\ & \left. 8 \text{ din } \left(\text{dself } \left(\text{ein}+3 \text{ ein Qin}+\text{eself Qin}+5 \text{ eout Qout}\right) + \right. \\ & \left. 5 \text{ dout } \left(\text{eout}+4 \text{ eout Qin}+4 \text{ ein Qout}+\text{eself Qout}\right)\right)\right) \left(-1+\mu\right) \end{aligned}$$

$$In[130]:=\beta DBexemple2 - \beta DB /. \{n \rightarrow 5, d \rightarrow 2\} // FullSimplify$$

Out[130]= **0** 

The difference is zero: we are fine!

V

Numerical comparison for the population of size 12

In[131]:= 
$$\gamma DBexemple = GetGamma [sBfDB, DfDB, G12generic, GE12generic, Q12generic, 12, 1, BstarDB /.  $\mathbb{N} \rightarrow 12]$  // FullSimplify

Out[131]=  $-\frac{1}{\mu} (-1 + p) p (-1 + dself^2 + 2 din^2 (1 + Qin) + 4 din (dself Qin + 9 dout Qout) + 9 dout (dout + 2 dout Qin + 6 dout Qout + 2 dself Qout)) (-1 +  $\mu$ )$$$

$$_{\text{In}[132]:=}$$
  $\gamma DB exemple$  –  $\gamma DB$  /.  $\left\{ n \rightarrow 3\text{ , }d \rightarrow 4\right\}$  // FullSimplify

Out[132]= 0

The difference is zero: we are fine!

Numerical comparison for the population of size 10

In[133]:= γDBexemple2 = GetGamma[sBfDB, DfDB, G10generic, GE10generic, Q10generic, 10, 1, BstarDB  $/. N \rightarrow 10$ ] // FullSimplify

$$\text{Out} [\text{133}] = -\frac{1}{\mu} \left(-1+p\right) \ p \left(-1+\text{dself}^2+4 \, \text{din}^2 \, \left(1+3 \, \text{Qin}\right) + 8 \, \text{din} \, \left(\text{dself Qin}+5 \, \text{dout Qout}\right) + 5 \, \text{dout} \, \left(\text{dout}+4 \, \text{dout Qin}+2 \, \text{dself Qout}\right)\right) \ \left(-1+\mu\right)$$

In[134]:= 
$$\gamma DBexemple2 - \gamma DB$$
 /.  $\{n \rightarrow 5, d \rightarrow 2\}$  // FullSimplify

Out[134]= **0** 

The difference is zero: we are fine!

#### Moran BD

The structure is the same as for Moran DB above - comments are lighter here!

#### Define $\delta B$ and $\delta D$

$$\label{eq:bounds} \begin{split} &\text{sBfBD}\big[\mathsf{G}_{\_},\,\mathtt{N}_{\_},\,\text{graphdegree}_{\_},\,\mathtt{j}_{\_},\,\mathtt{k}_{\_}\big] := \frac{\mathsf{Delta}\big[\mathtt{k}-\mathtt{j}\big]\,\mathtt{N}-\mathtt{1}}{\mathtt{N}^{2}}\,;\\ &\mathsf{DfBD}\big[\mathsf{G}_{\_},\,\mathtt{N}_{\_},\,\text{graphdegree}_{\_},\,\mathtt{j}_{\_},\,\mathtt{k}_{\_}\big] := \frac{\mathsf{G}\big[\![\mathtt{k},\,\mathtt{j}\,]\!]}{\mathtt{N}\,\text{graphdegree}} - \frac{1}{\mathtt{N}^{2}};\\ &\mathsf{BstarBD} = \frac{1}{\mathtt{N}}; \end{split}$$

### Equations $\beta$

In[138]:= βBDexemple = GetBeta[sBfBD, DfBD, G12generic, GE12generic, Q12generic, 12, 1, BstarBD /. N → 12 // FullSimplify Out[138]=  $\frac{1}{12 \, \mu}$ 

$$\begin{array}{l} (-1+p) \ p \ \Big(12 \ \Big( \left(-1+dself\right) \ \Big(eself+2 \ ein \ Qin+9 \ eout \ Qout\Big) \ +2 \ din \ \Big(ein+\left(ein+eself\right) \ Qin+9 \ eout \ Qout\Big) \ +9 \ dout \ \Big(eout+2 \ eout \ Qin+2 \ ein \ Qout+6 \ eout \ Qout+eself \ Qout\Big) \ +\\ \Big(-9 \ eout+11 \ eself-2 \ \Big(ein-10 \ ein \ Qin+\left(9 \ eout+eself\right) \ Qin\Big) \ -\\ 9 \ \Big(2 \ ein-3 \ eout+eself\Big) \ Qout\Big) \ \mu\Big) \end{array}$$

Check also the different terms separately

$$\begin{split} & \ln[139] \coloneqq \beta \text{IBDtest} = \text{Sum} \Big[ \left( \frac{\mu}{N^2} - \frac{\text{G} \llbracket \texttt{l}, \texttt{j} \rrbracket}{N} \right) \text{GE} \llbracket \texttt{k}, \texttt{l} \rrbracket \, \text{Q} \llbracket \texttt{j}, \texttt{k} \rrbracket, \left\{ \texttt{j}, \texttt{1}, \texttt{N} \right\}, \left\{ \texttt{k}, \texttt{1}, \texttt{N} \right\}, \left\{ \texttt{l}, \texttt{1}, \texttt{N} \right\} \Big] \; / \cdot \\ & \left\{ \texttt{G} \rightarrow \texttt{G12generic}, \, \texttt{GE} \rightarrow \texttt{GE12generic}, \, \texttt{Q} \rightarrow \texttt{Q12generic}, \, \texttt{N} \rightarrow \texttt{12} \right\} \; / / \; \text{FullSimplify} \; / / \; \text{Quiet} \\ & \text{Out}[139] = \; - \text{dself} \; \left( \text{eself} + 2 \, \text{ein} \, \text{Qin} + 9 \, \text{eout} \, \text{Qout} \right) \; - \; 2 \, \text{din} \; \left( \text{ein} + \left( \text{ein} + \text{eself} \right) \, \text{Qin} + 9 \, \text{eout} \, \text{Qout} \right) \; - \\ & 9 \, \text{dout} \; \left( \text{eout} + 2 \, \text{eout} \, \text{Qin} + 2 \, \text{ein} \, \text{Qout} + 6 \, \text{eout} \, \text{Qout} + \text{eself} \, \text{Qout} \right) \; + \\ & \frac{1}{12} \; \left( 2 \, \text{ein} + 9 \, \text{eout} + \text{eself} \right) \; \left( 1 + 2 \, \text{Qin} + 9 \, \text{Qout} \right) \; \mu \end{split}$$

 $ln[140]:= \beta IBDtest + \beta BDI /. \{n \rightarrow 3, d \rightarrow 4\} // FullSimplify$ 

Out[140]= 0

$$\ln[141] = \beta \text{DBDtest} = \text{Sum} \left[ \frac{(1-\mu)}{N} \text{ GE} [\![k, l]\!] \text{ Q} [\![l, k]\!], \{k, 1, N\}, \{l, 1, N\} \right] /.$$

 $\{G \rightarrow G12generic, GE \rightarrow GE12generic, Q \rightarrow Q12generic, N \rightarrow 12\}$  // FullSimplify // Quiet

$$Out[141] = -(eself + 2 ein Qin + 9 eout Qout) (-1 + \mu)$$

$$ln[142]:=\beta DBDtest - \beta BDD /. \{n \rightarrow 3, d \rightarrow 4\} // FullSimplify$$

Out[142]= **0** 

$$ln[143]:= \beta BDtest = \frac{p(1-p)}{\mu} (\beta DBDtest + \beta IBDtest) // FullSimplify;$$

Numerical comparison (the differences are zero: we are fine!)

$$In[144]:=$$
 \$BDtest - \$BD /.  $\{n \rightarrow 3, d \rightarrow 4\}$  // FullSimplify

Out[144]= 0

The difference is zero: we are fine!

$$ln[145]:=$$
  $\beta BDD - \beta DBD test /. \{n \rightarrow 3, d \rightarrow 4\} // Full Simplify$ 

Out[145]= **0** 

The difference is zero: we are fine!

$$ln[146]:= \beta BDI + \beta IBDtest /. \{n \rightarrow 3, d \rightarrow 4\} // FullSimplify$$

Out[146]= 0

The difference is zero: we are fine!

#### Equations *y*

```
In[147]:= γBDexemple = GetGamma[sBfBD, DfBD, G12generic,
              GE12generic, Q12generic, 12, 1, BstarBD /. N → 12] // FullSimplify
Out[147]= \frac{1}{12} \frac{1}{\mu} (-1 + p) p \left(12 \left(-1 + dself + 2 din Qin + 9 dout Qout\right) + \left(11 - 2 Qin - 9 Qout\right) \mu\right)
In[148]:= \gamma BD \times mple - \gamma BD /. \{n \rightarrow 3, d \rightarrow 4\} // Simplify
Out[148]= 0
```

The difference is zero: we are fine!

# Wright-Fisher

The structure is the same as for Moran DB above - comments are lighter here!

#### Define $\delta B$ and $\delta D$

```
In[149]:= sBfWF[G_, N_, graphdegree_, j_, k_] :=
          \frac{1}{graphdegree^2} \left( Delta[k-j] \; graphdegree^2 - Sum[G[j,\,i]] \; G[k,\,i]], \; \{i,\,1,\,N\}] \right);
       DfWF[G_, N_, graphdegree_, j_, k_] := 0;
       BstarWF = 1;
```

## Equations $\beta$

```
In[152]:= βWFexemple = GetBeta[sBfWF, DfWF, G12generic,
            GE12generic, Q12generic, 12, 1, BstarWF /. N → 12] // FullSimplify
Out[152]= -\frac{1}{\mu}(-1+p) p((-1+dself^2) (eself+2einQin+9eoutQout) +
              2 din<sup>2</sup> (ein + eself + 3 ein Qin + eself Qin + 18 eout Qout) +
              18 dout dself (eout + 2 eout Qin + 2 ein Qout + 6 eout Qout + eself Qout) +
              9 \text{ dout}^2 ((2 \text{ ein} + 6 \text{ eout} + \text{ eself}) (1 + 2 \text{ Qin}) + 3 (4 \text{ ein} + 21 \text{ eout} + 2 \text{ eself}) \text{ Qout}) +
              4 din (dself (ein + (ein + eself) Qin + 9 eout Qout) +
                  9 dout (eout + 2 eout Qin + 2 ein Qout + 6 eout Qout + eself Qout))) (-1 + \mu)
```

```
ln[153]:= \beta WF exemple - \beta WF /. \{n \rightarrow 3, d \rightarrow 4\} // Simplify
Out[153]= 0
```

The difference is zero: we are fine!

### Equations y

```
In[154]:= \gamma sBfWF, DfWF, G12generic,
           GE12generic, Q12generic, 12, 1, BstarWF /. N → 12 // FullSimplify
Out[154]= -\frac{1}{\mu}(-1+p) p(-1+dself^2+2din^2(1+Qin)+4din(dselfQin+9doutQout)+
            9 dout (dout + 2 dout Qin + 6 dout Qout + 2 dself Qout) (-1 + \mu)
ln[155]:= \gamma WF = \gamma WF /. \{n \rightarrow 3, d \rightarrow 4\} // Simplify
Out[155]= 0
```

The difference is zero: we are fine!

# Expected frequencies of altruists in the population

#### Moran BD

```
l_{n[156]} EXBD = p + \delta (\betaBD b - \gammaBD c) /. {Qin \rightarrow QinM, Qout \rightarrow QoutM} /. genericde // Simplify
Out[156]= (p(b-c)(-1+p)\delta\mu(m-n+Idself(-1+m)(-1+\mu)+\mu-m\mu)+
                      d^2 (-c Idself m n \delta - c m<sup>2</sup> n \delta + c Idself m<sup>2</sup> n \delta + c m n<sup>2</sup> \delta + c Idself m n p \delta + c m<sup>2</sup> n p \delta -
                            c Idself m<sup>2</sup> n p \delta - c m n<sup>2</sup> p \delta + Idself \mu - Idself m \mu - n \mu + 2 m n \mu - m n<sup>2</sup> \mu + 2 c Idself \delta \mu -
                            2 c Idself m \delta \mu – 2 c n \delta \mu – c Idself n \delta \mu + 2 c m n \delta \mu + 2 c Idself m n \delta \mu + c m<sup>2</sup> n \delta \mu –
                            c Idself m<sup>2</sup> n \delta \mu + c n<sup>2</sup> \delta \mu - 2 c m n<sup>2</sup> \delta \mu - 2 c Idself p \delta \mu + 2 c Idself m p \delta \mu +
                            2 c n p \delta \mu + c Idself n p \delta \mu - 2 c m n p \delta \mu - 2 c Idself m n p \delta \mu - c m<sup>2</sup> n p \delta \mu +
                            c Idself m<sup>2</sup> n p \delta \mu – c n<sup>2</sup> p \delta \mu + 2 c m n<sup>2</sup> p \delta \mu – Idself \mu<sup>2</sup> + Idself m \mu<sup>2</sup> + 2 n \mu<sup>2</sup> – 2 m n \mu<sup>2</sup> –
                            n^2 \mu^2 + m n^2 \mu^2 - c Idself \delta \mu^2 + c Idself m \delta \mu^2 + 2 c n \delta \mu^2 - 2 c m n \delta \mu^2 - c n^2 \delta \mu^2 +
                            c m n<sup>2</sup> \delta \mu^2 + c Idself p \delta \mu^2 - c Idself m p \delta \mu^2 - 2 c n p \delta \mu^2 + 2 c m n p \delta \mu^2 + c n<sup>2</sup> p \delta \mu^2 -
                            c m n^2 p \delta \mu^2 + b (-1 + g) (-1 + p) \delta (-1 + g) (-1 + \mu) - \mu (m + n (-1 + \mu) - \mu) +
                                    (-1 + m) n (-2 + \mu) \mu + Idself (-1 + m) (Ieself (m (-1 + \mu) - \mu) - (-2 + \mu) \mu))
                      d(m^2(-1 + \mu)(-1 + c(-1 + p)\delta + b(\delta - p\delta) + \mu) +
                            2 \operatorname{cp} \delta \mu - \operatorname{b} (-1 + \operatorname{p}) \delta (-3 + \operatorname{Ieself} + \operatorname{g} (2 + \operatorname{Ieself} (-1 + \mu) - \mu) + \mu - \operatorname{Ieself} \mu)) +
                                   n^{2} \ (\mu + c \ \delta \ (-1 + p + \mu - p \ \mu) \ ) \ ) + m \ \left( n \ (b \ (\delta - p \ \delta) \ - \ (-1 + c \ (-1 + p) \ \delta) \ (-1 + \mu) \ ) \ - \ (-1 + c \ (-1 + p) \ \delta) \ (-1 + \mu) \ ) \ - \ (-1 + c \ (-1 + p) \ \delta) \ (-1 + \mu) \ ) \ ) + m \ (-1 + p \ \delta) \ (-1 + \mu) \ ) \ ) + m \ (-1 + p \ \delta) \ (-1 + \mu) \ ) \ ) + m \ (-1 + p \ \delta) \ (-1 + \mu) \ ) \ )
                                   (-1+p) \delta \mu (2c (-1+\mu) + b (2-Ieself - 2\mu + g (-2+Ieself + \mu)))) +
                            Idself (-1+m) (m(1+b(-1+p)\delta+c(\delta-p\delta)-\mu)(-1+\mu)+\mu(1-\mu+c(-1+p))
                                            \delta (-3 + n + 2 \mu) + b (-1 + p) \delta (3 - Ieself - 2 \mu + g (-2 + Ieself + \mu))))))))
              (d (m^2 (-1 + \mu)^2 - Idself (-1 + m) (-1 + \mu) (m (-1 + \mu) + \mu - d \mu) - Idself (-1 + m))
                      (-1+d) n \mu (1+(-2+n) \mu) +
                      m n (-1 + \mu) (1 + d (-2 + n) \mu))
```

#### Moran DB

```
log(157) = EXDB = p + \delta (\beta DB b - \gamma DB c) /. \{Qin \rightarrow QinM, Qout \rightarrow QoutM\} /. genericde // Simplify
Out[157]= \left(p\left((-1+n)\left(n-dn\right)^{3}\left(-m^{2}\left(-1+\mu\right)^{2}+Idself\left(-1+m\right)\left(-1+\mu\right)\left(m\left(-1+\mu\right)+\mu-d\mu\right)+\mu\right)\right)
                                                           (-1+d) n \mu (1+(-2+n) \mu) - m n (-1+\mu) (1+d (-2+n) \mu) +
                                              (-1+d)^2 n^3 (1-p) \delta (-1+\mu) (c (-1+d) (-1+n) (mn (2+d (n (-1+\mu) -2 \mu)) - (-1+d)^2 n^3 (1-p) \delta (-1+\mu) (-1+
                                                                        (-1+d) (-2+n) n \mu + m^2 (-2+d n + \mu) - Idself^2 (-1+m)^2 (d (m (-1+\mu) - \mu) + \mu) + \mu
                                                                       Idself (-1 + m) (d m^2 (-1 + \mu) + 2 (-1 + d) \mu + m (2 - 2 d \mu))) +
                                                          b (2 \text{ m}^2 - 2 \text{ d m}^2 - 2 \text{ d Ieself m}^2 + 2 \text{ d}^2 \text{ Ieself m}^2 + 2 \text{ d g Ieself m}^2 - 2 \text{ d}^2 \text{ g Ieself m}^2 +
                                                                       dgm^3 + dIeselfm^3 - d^2Ieselfm^3 - dgIeselfm^3 + d^2gIeselfm^3 - 2mn + 2dmn +
                                                                      2 d Ieself m n - 2 d^2 Ieself m n - 2 d g Ieself m n + 2 d^2 g Ieself m n - 2 m^2 n +
                                                                       3 d m^2 n - d^2 m^2 n - 2 d g m^2 n + d^2 g m^2 n - d m^3 n + d^2 m^3 n - d^2 g m^3 n + 2 m n^2 - 3 d m n^2 +
                                                                       d^2 m n^2 + d g m n^2 - d^2 g m n^2 - d Ieself m n^2 + d^2 Ieself m n^2 + d g Ieself m n^2 - d
                                                                      d^2 g Ieself m n^2 + d m<sup>2</sup> n^2 - d^2 m<sup>2</sup> n^2 + d^2 g m<sup>2</sup> n^2 + 2 g m \mu - 2 d g m \mu + 2 Ieself m \mu -
                                                                       4 d Ieself m \mu + 2 d<sup>2</sup> Ieself m \mu - 2 g Ieself m \mu + 4 d g Ieself m \mu - 2 d<sup>2</sup> g Ieself m \mu -
                                                                      m^2 \mu + d m^2 \mu - g m^2 \mu + 2 d g m^2 \mu - Ieself m^2 \mu + 4 d Ieself m^2 \mu - 3 d^2 Ieself m^2 \mu +
                                                                      g Ieself m<sup>2</sup> \mu – 4 d g Ieself m<sup>2</sup> \mu + 3 d<sup>2</sup> g Ieself m<sup>2</sup> \mu – d g m<sup>3</sup> \mu – d Ieself m<sup>3</sup> \mu +
                                                                       d^2 Ieself m^3 \mu + d g Ieself m^3 \mu - d^2 g Ieself m^3 \mu + 2 n \mu - 4 d n \mu + 2 d^2 n \mu -
                                                                      2 g n \mu + 4 d g n \mu - 2 d<sup>2</sup> g n \mu - 2 Ieself n \mu + 4 d Ieself n \mu - 2 d<sup>2</sup> Ieself n \mu +
                                                                      2 g Ieself n \mu - 4 d g Ieself n \mu + 2 d<sup>2</sup> g Ieself n \mu - 2 m n \mu + 6 d m n \mu - 4 d<sup>2</sup> m n \mu -
                                                                      4 d g m n \mu + 4 d<sup>2</sup> g m n \mu - 2 d Ieself m n \mu + 2 d<sup>2</sup> Ieself m n \mu + 2 d g Ieself m n \mu -
                                                                       2 d^{2} g Ieself m n \mu + 2 m<sup>2</sup> n \mu - 5 d m<sup>2</sup> n \mu + 3 d<sup>2</sup> m<sup>2</sup> n \mu + 2 d g m<sup>2</sup> n \mu - 3 d<sup>2</sup> g m<sup>2</sup> n \mu +
                                                                       d m^3 n \mu - d^2 m^3 n \mu + d^2 g m^3 n \mu - n^2 \mu + 2 d n^2 \mu - d^2 n^2 \mu + g n^2 \mu - 2 d g n^2 \mu + d^2 g n^2 \mu + 
                                                                       Ieself n^2 \mu – 2 d Ieself n^2 \mu + d^2 Ieself n^2 \mu – g Ieself n^2 \mu + 2 d g Ieself n^2 \mu –
                                                                       d^2 g Ieself n^2 \mu – d m n^2 \mu + d^2 m n^2 \mu + d g m n^2 \mu – d^2 g m n^2 \mu + d Ieself m n^2 \mu –
                                                                       d^2 Ieself m n^2 \mu - d g Ieself m n^2 \mu + d^2 g Ieself m n^2 \mu - (-1 + d) (-1 + g)
                                                                            Idself<sup>2</sup> (-1 + Ieself) (-1 + m)^2 (d (m (-1 + \mu) - \mu) + \mu) + Idself (-1 + m)
                                                                             d m^2 (-1-2 g (-1+Ieself) + 2 Ieself + d (-1+g) (-1+2 Ieself - n) - n) (-1+g) 
                                                                                                 \mu) + 2 (-1 + d)^2 (-1 + g) (-1 + Ieself) \mu - 2 (-1 + d) m (-1 + n + g) \mu + Ieself \mu -
                                                                                                 g Ieself \mu – n \mu – d (-1 + g) (Ieself + n (-1 + \mu) + \mu – 2 Ieself \mu)))))) /
                           (-1+n) (n-dn)^3 (-m^2 (-1+\mu)^2 + Idself (-1+m) (-1+\mu) (m (-1+\mu) + \mu - d\mu) + \mu - d\mu)
                                             (-1 + d)
                                                 n
                                                 (1 + (-2 + n) \mu) - m
                                                 n
                                                 (-1 + \mu)
                                                 (1 + d (-2 + n) \mu))
```

# Wright - Fisher

ln[158] = EXWF = p + δ (βWF b - γWF c) /. {Qin → QinWF, Qout → QoutWF} /. genericde // Simplify

$$\begin{split} \cos(\log p) &= p + \frac{1}{\rho} \left( 1 - p \right) p \, \delta \left[ - c \left( 1 - \mu - \left( 1 - \mu \right) \left[ \frac{Idsel f^2 \left( - 1 + m \right)^2}{n^2} + \frac{\left( - 1 + m \right)^2}{\left( 1 + n \right) n^2} + \frac{m^2}{\left( 1 + n \right) n^2} \right] + \frac{m^2}{\left( - 1 + d \right) n^2} - \left( 2 + d \left( - 2 + m \right) \right) m \left( - \frac{1}{1 - \frac{1 + d}{\left( - 1 + m \right)^2 + \left( - 1 + m \right)^2}{\left( - 1 + d \right)} + \frac{1}{2 \, \mu \cdot \mu^2} \right) \right) / \\ &= \left( \left( - 1 + d \right) \left( \frac{-1 + d}{1 - \frac{1 + d}{\left( - 1 + m \right)^2 + \left( - 1 + d \right)}} + \frac{d \left( - 1 + n \right)}{1 - \frac{\left( - 1 + d \right)^2 + \left( - 1 + d \right)}{\left( - 1 + d \right)} + \frac{1}{2 \, \mu \cdot \mu^2} \right) \right) / \\ &= \left( 2 \left( - 1 + d \right) \left[ Idsel f \left( - 1 + m \right)^2 - \left( - 1 + d \right) \right] \left[ Idsel f^2 \left( - 1 + m \right)^2 + \left( - 1 + d \right) \right] \\ &= \left( 2 \left( - 1 + d \right) \left[ Idsel f \left( - 1 + m \right)^2 - \left( - 1 + d \right) \right] \left[ Idsel f^2 \left( - 1 + m \right)^2 + \left( - 1 + d \right) \right] \\ &= \left( 2 \left( - 1 + d \right) \left[ Idsel f \left( - 1 + m \right)^2 - \left( - 1 + d \right) \right] \left[ Idsel f^2 \left( - 1 + m \right)^2 + \left( - 1 + d \right) \right] \right] \\ &= \left( - 1 + d \right) \left[ \frac{-1 + d}{1 - \frac{4 + d}{\left( - 1 + m \right)^2 + \left( - 1 + d \right)^2}} + \frac{d \left( - 1 + n \right)}{1 - \frac{4 + d}{\left( - 1 + m \right)^2 + \left( - 1 + d \right)^2}} + \frac{1}{2 \, \mu - \mu^2} \right) \right] \right) / \\ &= \left( 1 - \mu \right) \left[ \frac{-1 + d}{1 - \frac{4 + d}{\left( - 1 + m \right)^2 + \left( - 1 + d \right)^2}} + \frac{d \left( - 1 + n \right)}{1 - \frac{4 + d}{\left( - 1 + m \right)^2 + \left( - 1 + d \right)^2}} + \frac{1}{2 \, \mu - \mu^2} \right) \right] \right) / \\ &= \left( (1 - g) \left( Iesel f - n \right) \left( \frac{-1 + d}{1 - \frac{4 + d}{\left( - 1 + m \right)^2 + \left( - 1 + m \right)^2}} - \frac{d}{1 - \frac{4 - d}{\left( - 1 + m \right)^2 + \left( - 1 + d \right)^2}} + \frac{1}{2 \, \mu - \mu^2} \right) \right) \right) / \\ &= \left( Idsel f - Idsel f m \right)^2 \left( Iesel f - g Iesel f -$$

$$\left( 1 + \left( (-1+n) \left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) \right)$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) \right)$$

$$\frac{1}{n} 2 \, Idself \, (1-m) \, m \left( \left[ (1-g) \left( -\frac{1}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{2\mu - \mu^2} \right) \right] \right)$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{2\mu - \mu^2} \right) \right)$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{1}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) + \left( (1-g) \, Ieself \right)$$

$$\left( \frac{-1+d}{1 - \frac{(1+d(d-1+m))^2 + (1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d-1+m)(2-1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d-1+m)(2-1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1+d-1+m)(2-1+n)^2}{(-1+d)^2}} + \frac{d}{1 - \frac{(1+1)(dself)^2 + (1+n)^2}{(-1+n)^2}} + \frac{1}{2\mu - \mu^2} \right) \right) /$$

$$\left( \frac{-1+d}{1 - \frac{(1$$

$$\left( \frac{-1+d}{1-\frac{(1+d)(-1+m))^2}{(-1+d)^2}} + \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) + \\ \left( g\left(-1+n\right) \left( \frac{-1+d}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} - \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) \right/ \\ \left( n \left( \frac{-1+d}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) \right) + \frac{1}{n} \right)$$
 
$$Idself\left( 1-m \right) \left( \frac{(-1+g)\left( Ieself-n \right)}{(-1+n)} + \left( g\left( -\frac{1}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) \right) \right/ \\ \left( \frac{-1+d}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) \right/ \\ \left( \frac{-1+d}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) / \\ \left( n \left( \frac{-1+d}{1-\frac{(1+d)(-1+m))^2(-1+\mu)^2}{(-1+d)^2}} + \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) / \\ \left( 1-g \right) \left( Ieself-n \right) \left( -2+n \right) \left( \frac{-1+d}{1-\frac{(1+d)(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{1}{2\,\mu-\mu^2} \right) \right) / \\ \left( 1-g \right) \left( Ieself-n \right) \left( -2+n \right) \left( \frac{-1+d}{1-\frac{(1+d)(-1+m)^2(-1+\mu)^2}{(-1+n)^2}}} + \frac{1}{2\,\mu-\mu^2} \right) \right) / \\ \left( \frac{-1+d}{1-\frac{(1+d)(-1+m)^2(-1+\mu)^2}{(-1+n)^2}} + \frac{d}{1-\frac{(-1+Idself)^2(-1+m)^2(-1+\mu)^2}{(-1+n)^2}}} + \frac{1}{2\,\mu-\mu^2} \right) \right) \right) \right) \right)$$

# Export to R

# Export the EX formulas to R

Rewrite the Greek letters

$$\label{eq:continuous_line_state} \begin{split} & \text{In[159]:= GreekTerms = } \left\{ \delta \rightarrow \text{sel, } \mu \rightarrow \text{mut} \right\} \\ & \text{Out[159]:= } \left\{ \delta \rightarrow \text{sel, } \mu \rightarrow \text{mut} \right\} \end{split}$$

Common parts to all functions

```
Initiable:= FunctionPartB = " <- function(b, c, p, sel, mut, m, g, n, d, Idself, Ieself) {</pre>
     ## Arguments:
     # b
           benefit of interaction
             cost of interaction
     # C
     # p mutation bias
     # sel intensity of selection
     # mut mutation probability
             emigration probability
     # m
             proportion of
     # g
          interactions out of the group (interaction equivalent of m)
             deme size
     # n
     # d
             number of demes
     # Idself whether reproduction in site where the parent is
     # Ieself whether interactions with oneself
      return(
      ";
     FunctionPartE = ")
     }";
     Function to translate Mathematica to R
In[162]:= ToRForm[x_] := ToString[x /. GreekTerms // CForm]
     Do it for all life cycles
In[163]:= RtxtBD = "pBD " <> FunctionPartB <> ToRForm[EXBD] <> FunctionPartE;
     RtxtDB = "pDB " <> FunctionPartB <> ToRForm[EXDB] <> FunctionPartE;
     RtxtWF = "pWF " <> FunctionPartB <> ToRForm[EXWF] <> FunctionPartE;
     Define Power function in R
In[166]:= PowerDef = "Power <- function(a,b) return(a^b)";</pre>
     Combine all texts
In[167]:= Rtxt = PowerDef <> "
     " <> RtxtBD <> "
     " <> RtxtDB <> "
     " <> RtxtWF;
     Export to txt file (Mathematica did not want R)
In[168]:= Export[pathtosave <> "Mathematica/analytics.txt", Rtxt];
     Convert the file extension to R
In[169]:= cmd = "mv" <> " " <> pathtosave <>
         "Mathematica/analytics.txt "<> pathtosave <> "Mathematica/analytics.R";
In[170]:= Get["!"<> cmd];
```

## Export to R the $\beta$ and $\gamma$ functions

Rewrite the Greek letters

```
ln[171]:= GreekTerms = \{\omega \rightarrow sel, \mu \rightarrow mut\}
Out[171]= \{\omega \rightarrow \text{sel}, \mu \rightarrow \text{mut}\}
      Common parts to all functions
In[172]:= FunctionPartB = " <- function(p, sel, mut, m, g, n, d, Idself, Ieself) {</pre>
      ## Arguments:
      # p
              mutation bias
      # sel intensity of selection
      # mut mutation probability
              emigration probability
              proportion of
           interactions out of the group (interaction equivalent of m)
              deme size
              number of demes
      # Idself whether reproduction in site where the parent is
      # Ieself whether interactions with oneself
      return(
      FunctionPartE = ")
      }";
      Function to translate Mathematica to R
In[174]:= ToRForm[x_] := ToString[x /. GreekTerms // CForm]
      Do it for \beta and \gamma
In[175]:= RtxtbBDD = "bBDD " <> FunctionPartB <> ToRForm[
           βBDD /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
      RtxtbBDI = "bBDI " <> FunctionPartB <> ToRForm[
           βBDI /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
      RtxtcBDD = "cBDD " <> FunctionPartB <> ToRForm[
           γBDD /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
      RtxtcBDI = "cBDI " <> FunctionPartB <> ToRForm[
           YBDI /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
```

```
In[179]:=
      RtxtbDBD = "bDBD " <> FunctionPartB <> ToRForm[
           βDBD /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
      RtxtbDBI = "bDBI " <> FunctionPartB <> ToRForm[
           βDBI /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
      RtxtcDBD = "cDBD " <> FunctionPartB <> ToRForm[
           \gamma DBD /. \{Qin \rightarrow QinM, Qout \rightarrow QoutM\} /. genericde // FullSimplify] <> FunctionPartE;
      RtxtcDBI = "cDBI " <> FunctionPartB <> ToRForm[
           γDBI /. {Qin → QinM, Qout → QoutM} /. genericde // FullSimplify] <> FunctionPartE;
In[183]:= RtxtbWFD = "bWFD " <> FunctionPartB <> ToRForm[
           βWFD /. {Qin → QinWF, Qout → QoutWF} /. genericde // Simplify] <> FunctionPartE;
      RtxtbWFI = "bWFI " <> FunctionPartB <> ToRForm[
           βWFI /. {Qin → QinWF, Qout → QoutWF} /. genericde // Simplify] <> FunctionPartE;
      RtxtcWFD = "cWFD " <> FunctionPartB <> ToRForm[
           γWFD /. {Qin → QinWF, Qout → QoutWF} /. genericde // Simplify] <> FunctionPartE;
In[186]:= RtxtcWFI = "cWFI " <> FunctionPartB <> ToRForm[
           %WFI /. {Qin → QinWF, Qout → QoutWF} /. genericde // Simplify] <> FunctionPartE;
      Define Power function in R
In[187]:= PowerDef = "Power <- function(a,b) return(a^b)";</pre>
      Combine all texts
```

```
In[188]:= Rtxt = PowerDef <> "
      " <> RtxtbBDD <> "
      "<>RtxtbBDI<>"
      " <> RtxtcBDD <> "
      " <> RtxtcBDI <> "
      " <> RtxtbDBD <> "
      " <> RtxtbDBI <> "
      " <> RtxtcDBD <> "
      " <> RtxtcDBI <> "
      " <> RtxtbWFD <> "
      " <> RtxtbWFI <> "
      " <> RtxtcWFD <> "
      " <> RtxtcWFI;
      Export to txt file (Mathematica did not want R)
In[189]:= Export[pathtosave <> "Mathematica/analyticsBC.txt", Rtxt];
      Convert the file extension to R
In[190]:= cmd = "mv " <> pathtosave <> "Mathematica/analyticsBC.txt " <>
        pathtosave <> "Mathematica/analyticsBC.R"
Out[190]= mv
         ~/Documents/Work/Projects/2016_SocEvolSubdivPop/Programs/Mathematica/analyticsBC.
         ~/Documents/Work/Projects/2016_SocEvolSubdivPop/Programs/Mathematica/analyticsBC.R
In[191]:= Get["!"<> cmd];
```

# 3) Changes with m

Here, we consider a population structure

- with no social interactions with oneself (eself = 0),

- such that an offspring can establish at the very site of its parent and replace it (dself > 0),
- with social interactions strictly within a deme (g = 0).

(i.e., the structure used in the manuscript).

```
log(192):= mychange = genericde /. Idself \rightarrow 1 /. Ieself \rightarrow 0 /. g \rightarrow 0;
        ApplyParms[x] := x /. genericde /. Idself \rightarrow 1 /. Ieself \rightarrow 0 /. g \rightarrow 0
```

Parameters values used in figure 2

ln[194]:= figparms = {b \rightarrow 15, c \rightarrow 1, d \rightarrow 15, n \rightarrow 4, p \rightarrow 0.45,  $\delta \rightarrow 0.005$ };

# Probabilities of identity by descent change with the emigration probability m

Moran: derivatives with respect to m

#### Qin

In[195]:= D[QinMs, m] // FullSimplify

$$\frac{\left(-1+d\right)^2 \ n \ \left(-1+\mu\right) \ \mu^2}{\left(\left(-1+d\right) \ \mu \ \left(1+\left(-1+n\right) \ \mu\right) - m \ \left(-1+\mu\right) \ \left(1+d \ \left(-1+n\right) \ \mu\right)\right)^2}$$

-> The slope is negative for Qin

### Qout

In[196]:= D[QoutMs, m] // FullSimplify

$$\text{Out[196]=} \ -\frac{\left(-1+d\right) \ \left(-1+\mu\right) \ \mu \ \left(1+ \ \left(-1+n\right) \ \mu\right)}{\left( \left(-1+d\right) \ \mu \ \left(1+ \ \left(-1+n\right) \ \mu\right) - m \ \left(-1+\mu\right) \ \left(1+d \ \left(-1+n\right) \ \mu\right)\right)^2}$$

-> It is positive for Qout.

# Wright - Fisher: derivatives with respect to m

#### Qin

In[197]:= dqw = D[QinWFs, m] // FullSimplify

$$\begin{array}{l} \text{Out} [197] = \end{array} \left( 2 \, \left( -1 + d \right)^3 \, \left( 1 + d \, \left( -1 + m \right) \right) \, n \, \left( -2 + \mu \right)^2 \, \left( -1 + \mu \right)^2 \, \mu^2 \right) \, / \\ \\ \left( \left( -1 + d \right)^2 \, \left( -2 + \mu \right) \, \mu \, \left( -1 + \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \, - \\ \\ 2 \, \left( -1 + d \right) \, m \, \left( -1 + \mu \right)^2 \, \left( -1 + d \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \, + d \, m^2 \, \left( -1 + d \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \right)^2 \\ \end{array}$$

Out[199]= 
$$-\frac{2 n (-1 + \mu)^2}{(-1 + (-1 + n) (-2 + \mu) \mu)^2}$$

$$\text{Out}[200] = \left(2 \left(-1 + d\right)^3 \ n \ \mu^2 \ \left(2 - 3 \ \mu + \mu^2\right)^2\right) \left/ \left(-2 - d^2 \ n \ \left(-2 + \mu\right) \ \mu + \left(-2 + \mu\right) \ \mu \ \left(-3 + \left(-1 + n\right) \ \left(-2 + \mu\right) \ \mu\right) + d \ \left(1 + \left(1 + 2 \ n\right) \ \left(-2 + \mu\right) \ \mu\right)\right)^2 \right) \right)$$

-> The slope of QinWF is negative until mc =  $\frac{d-1}{d}$ , positive after.

#### Qout

In[201]:= dqwo = D[QoutWFs, m] // FullSimplify

$$\text{Out[202]=} \ \left\{ \left\{ m \to \frac{-1+d}{d} \right\} \right\}$$

-> And it is the opposite for QoutWF.

# BD life-cycle, changes with m

# Indirect/secondary term

$$In[203]:=$$
 bi =  $\beta BDI /. \{Qin \rightarrow QinM, Qout \rightarrow QoutM\} /. mychange // FullSimplify$ 

$$\text{Out[203]=} \ \ \frac{-\, d\,\, m + d\,\, \left(1 + d\,\, \left(-\, 1 + m\right) \,\, + \, m\right) \,\, \mu + \, \left(-\, 1 + d - d\,\, m\right) \,\, \mu^2 }{d\,\, \left(-\, \left(-\, 1 + d\right) \,\, \mu \,\, \left(1 + \,\, \left(-\, 1 + n\right) \,\, \mu\right) \,\, + \,\, m\,\, \left(-\, 1 + \mu\right) \,\, \left(1 + d\,\, \left(-\, 1 + n\right) \,\, \mu\right) \,\right) }$$

Derivative with respect to m

$$\text{Out} [204] = -\left(\left(\left(-1+d\right)^2 \left(1+d \ n-\mu\right) \ \mu^2\right) \middle/ \left(d \ \left(\left(-1+d\right) \ \mu \ \left(1+\left(-1+n\right) \ \mu\right) - m \ \left(-1+\mu\right) \ \left(1+d \ \left(-1+n\right) \ \mu\right)\right)^2\right)\right)$$

#### -> βBDI decreases with m

#### EX

In[205]:= ex = EXBD // ApplyParms // FullSimplify

$$\begin{array}{l} \text{Out} [\text{205}] = & - \left( \left( p \, \left( \left( b - c \right) \, \left( -1 + p \right) \, \delta \, \mu + d \, \left( m + \left( b - c \right) \, m \, \left( -1 + p \right) \, \delta \, - \right. \right. \right. \\ & \left. \left( 1 + m + \left( 3 \, b + c \, \left( -3 + n \right) \right) \, \left( -1 + p \right) \, \delta \right) \, \mu + \left( 1 - n + \left( b + c \, \left( -1 + n \right) \right) \, \left( -1 + p \right) \, \delta \right) \, \mu^2 \right) + \\ & \left. d^2 \, \left( c \, m \, n \, \left( -1 + p \right) \, \delta + \mu + \left( m \, \left( -1 + n \right) \, - \left( 2 \, \left( b - c \right) \, \left( -1 + m \right) + c \, \left( -1 + 2 \, m \right) \, n \right) \, \left( -1 + p \right) \, \delta \right) \, \mu + \\ & \left. \left( -1 + m \right) \, \left( 1 - n + \left( b + c \, \left( -1 + n \right) \, \right) \, \left( -1 + p \right) \, \delta \right) \, \mu^2 \right) \right) \right) \right) \\ & \left. \left( d \, \left( - \left( -1 + d \right) \, \mu \, \left( 1 + \left( -1 + n \right) \, \mu \right) + m \, \left( -1 + \mu \right) \, \left( 1 + d \, \left( -1 + n \right) \, \mu \right) \right) \right) \right) \right) \right. \\ \end{array}$$

Derivative with respect to m

Out[207]= { }

EX is a monotonic function of m. Is it increasing or decreasing? This depends on  $\mu$ :

$$In[208]:=$$
 muc = Solve[dex == 0,  $\mu$ ] // FullSimplify

$$\text{Out[208]= } \left\{ \left\{ \mu \to 0 \right\} \text{, } \left\{ \mu \to -\frac{b-c-2 \ b \ d \ n + \sqrt{\left(b-c\right) \ \left(b-c+4 \ b \ d^2 \ n^2\right)}}{2 \ b \ d \ n} \right\} \text{, } \left\{ \mu \to \frac{c+b \ \left(-1+2 \ d \ n\right) + \sqrt{\left(b-c\right) \ \left(b-c+4 \ b \ d^2 \ n^2\right)}}{2 \ b \ d \ n} \right\} \right\}$$

We want the middle one (admissibility)

$$In[209]:=$$
 mucBD =  $\mu$  /. muc[2]] // FullSimplify;

Simplify in more human form

$$ln[210]:= 1 - \frac{b-c+\sqrt{\left(b-c\right)\,\left(b-c+4\,b\,d^2\,n^2\right)}}{2\,b\,d\,n} - mucBD$$
 // FullSimplify

Out[210]= 0

$$ln[211]:=$$
 dex /.  $\mu \rightarrow 1$  // FullSimplify

$$\mathsf{Out}[\mathsf{211}] = -\frac{\left(b-c\right) \left(-1+p\right) \ p \ \delta}{n}$$

->  $E[\overline{X}]$  is increasing with m when  $\mu > \mu_c^{BD}$ , decreasing otherwise (but flat when  $\mu = 0$ ).

$$\mu_c^{\text{BD}} = 1 - \frac{b-c+\sqrt{(b-c)(b-c+4bd^2n^2)}}{2bdn}$$

# DB life - cycle, changes with m

## Indirect/secondary term

$$ln[248]:=$$
 bi =  $\beta$ DBI /. {Qin  $\rightarrow$  QinM, Qout  $\rightarrow$  QoutM} /. mychange // FullSimplify

$$\text{Out}[248] = \frac{ \left( -1 + \mu \right) \, \left( m + \left( 1 + d \, \left( -1 + m \right) \, \right) \, \left( -1 + m \right) \, \mu \right) }{ - \left( -1 + d \right) \, \mu \, \left( 1 + \left( -1 + n \right) \, \mu \right) \, + \, m \, \left( -1 + \mu \right) \, \left( 1 + d \, \left( -1 + n \right) \, \mu \right) }$$

Derivative with respect to m

$$\begin{array}{l} \text{Out} [249] = \end{array} \left( \left( -1 + \mu \right) \ \left( - \left( -1 + \mu \right) \ \left( m + \left( 1 + d \ \left( -1 + m \right) \ \right) \ \left( -1 + m \right) \ \mu \right) \ \left( 1 + d \ \left( -1 + n \right) \ \mu \right) + \\ \left( 1 + \left( 1 + 2 \ d \ \left( -1 + m \right) \ \mu \right) \ \left( - \left( -1 + d \right) \ \mu \ \left( 1 + \left( -1 + n \right) \ \mu \right) + m \ \left( -1 + \mu \right) \ \left( 1 + d \ \left( -1 + n \right) \ \mu \right) \right) \right) \right) \right) \\ \left( \left( \left( -1 + d \right) \ \mu \ \left( 1 + \left( -1 + n \right) \ \mu \right) - m \ \left( -1 + \mu \right) \ \left( 1 + d \ \left( -1 + n \right) \ \mu \right) \right)^{2} \right) \right) \right)$$

$$\begin{aligned} \text{Out} & [250] = \ \left\{ \left\{ \mathbf{m} \to \left( \left( -\mathbf{1} + \mathbf{d} \right) \ \mathbf{d} \ \left( -\mathbf{1} + \mu \right) \ \mu \ \left( \mathbf{1} + \left( -\mathbf{1} + \mathbf{n} \right) \ \mu \right) - \right. \\ & \left. \sqrt{ \left( \left( -\mathbf{1} + \mathbf{d} \right)^2 \ \mathbf{d} \ \left( -\mathbf{1} + \mu \right)^2 \ \mu \ \left( \mathbf{n} + \left( -\mathbf{1} + \mu \right)^2 + \mathbf{d} \ \mathbf{n}^2 \ \mu - \mathbf{n} \ \mu^2 \right) \right) \right) \left/ \left( \mathbf{d} \ \left( -\mathbf{1} + \mu \right)^2 \ \left( \mathbf{1} + \mathbf{d} \ \left( -\mathbf{1} + \mathbf{n} \right) \ \mu \right) \right) \right\}, \\ & \left\{ \mathbf{m} \to \left( \left( -\mathbf{1} + \mathbf{d} \right) \ \mathbf{d} \ \left( -\mathbf{1} + \mu \right) \ \mu \ \left( \mathbf{1} + \left( -\mathbf{1} + \mathbf{n} \right) \ \mu \right) + \right. \\ & \left. \sqrt{ \left( \left( -\mathbf{1} + \mathbf{d} \right)^2 \ \mathbf{d} \ \left( -\mathbf{1} + \mu \right)^2 \ \mu \ \left( \mathbf{n} + \left( -\mathbf{1} + \mu \right)^2 + \mathbf{d} \ \mathbf{n}^2 \ \mu - \mathbf{n} \ \mu^2 \right) \right) \right) \left/ \left( \mathbf{d} \ \left( -\mathbf{1} + \mu \right)^2 \ \left( \mathbf{1} + \mathbf{d} \ \left( -\mathbf{1} + \mathbf{n} \right) \ \mu \right) \right) \right\} \right\} \end{aligned}$$

the first term is negative -> not solution

$$ln[251] := mcDBI = m / . mcs[2];$$

Second derivative of  $\beta$ DBI with respect to m, evaluated at the critical value of m

$$In[252]:= D[bi, m, m] /. m \rightarrow mcDBI // FullSimplify$$

Out[252]= 
$$\frac{2 d^2 (-1 + \mu)^2 \mu}{\sqrt{(-1 + d)^2 d (-1 + \mu)^2 \mu (n + (-1 + \mu)^2 + d n^2 \mu - n \mu^2)}}$$

-> It is a minimum.

In[253]:= Limit[mcDBI, 
$$\mu \rightarrow 0$$
]

Out[253]= 0

Compare the value of this critical value to  $\frac{d-1}{d}$ 

$$In[254]:=$$
 ddd = mcDBI -  $\frac{(d-1)}{d}$  // FullSimplify

$$\begin{array}{l} \text{Out} [254] = & \frac{1}{d} \\ & \left( 1 + \left( \sqrt{\left( -1 + d \right)^2 \ d \ \left( -1 + \mu \right)^2 \ \mu \ \left( n + \ \left( -1 + \mu \right)^2 + d \ n^2 \ \mu - n \ \mu^2 \right)} \right. \\ & + \left. d \ \left( -1 + \mu \right) \ \left( 1 + \mu \ \left( -2 + d \ n + \mu - n \ \mu \right) \right) \right) \right) \end{array}$$

Out[255]= 
$$\left\{ \left\{ d \rightarrow 1 \right\} \right\}$$

ddd has a constant sign (because d > 1); it is the same sign as when  $\mu$ ->0, i.e. it is negative This means that mcDBI  $< \frac{d-1}{d}$ .

 $\rightarrow$  BDBI reaches a minimum when m = mcDBI,

with mcDBI  $< \frac{d-1}{d}$ . In the manuscript, we denote mcDBI by the symbol m<sub>c</sub>'.

The formula for m<sub>c</sub>' is

In[256]:= mcDBI

$$\left( \left( -1 + d \right) d \left( -1 + \mu \right) \mu \left( 1 + \left( -1 + n \right) \mu \right) + \sqrt{\left( -1 + d \right)^2} d \left( -1 + \mu \right)^2 \mu \left( n + \left( -1 + \mu \right)^2 + d n^2 \mu - n \mu^2 \right) \right) \right)$$

$$\left( d \left( -1 + \mu \right)^2 \left( 1 + d \left( -1 + n \right) \mu \right) \right)$$

EX

In[257]:= ex = EXDB // ApplyParms // FullSimplify

$$\begin{array}{l} \text{Out} [257] = \end{array} \left( p \, \left( \, \left( \, b - c \, \right) \, d \, m^2 \, \left( \, -1 + p \, \right) \, \, \delta \, \left( \, -1 + \mu \, \right) \, \, + \\ & \left( \, -1 + d \, \right) \, \, \mu \, \left( \, -1 + b \, \left( \, -1 + p \, \right) \, \, \delta \, \left( \, -1 + \mu \, \right) \, \, + c \, \, \left( \, -1 + p \, \right) \, \, \delta \, \, \left( \, -1 + \mu \, \right) \, \, + \mu \, - n \, \, \mu \right) \, - \, m \, \left( \, -1 + \mu \, \right) \, \, \left( \, -1 + d \, \mu \, - d \, n \, \, \mu \, + b \, \, \left( \, -1 + p \, \right) \, \, \delta \, \left( \, -2 + d \, + d \, \, \mu \, \right) \, + c \, \, \left( \, -1 + p \, \right) \, \, \delta \, \left( \, 2 - d \, \, \left( \, 1 + n \, \right) \, \, + d \, \, \left( \, -1 + n \, \right) \, \, \mu \right) \, \right) \, \right) \, \left( \, - \left( \, -1 + d \, \right) \, \, \mu \, \left( \, 1 + \left( \, -1 + n \, \right) \, \, \mu \, \right) \, + \, m \, \left( \, -1 + \mu \, \right) \, \, \left( \, 1 + d \, \left( \, -1 + n \, \right) \, \, \mu \, \right) \, \right) \, \right) \, \right) \, \left( \, -1 + d \, \mu \, + \, \mu \, - \, n \, \, \mu \, \right) \, \left( \, -1 + \mu \, \right) \, \, \, \left( \, -1 + \mu \, \right) \, \, \left( \, -1 + \mu \, \right) \, \, \, \left( \, -1 + \mu \, \right)$$

Derivative with respect to m

```
In[258]:= dex = D[ex, m] // FullSimplify
Out[258]= (-1 + p) p \delta (-1 + \mu)
                                                                                                                                 \left(1+d\;\left(-1+m\right)\;\right)^{2}\;\left(-1+n\right)\;\mu^{2}\right)\;+\;b\;\left(-d\;m^{2}\;+\;\mu\;+\;d\;\left(-2+m\;\left(2+m\right)\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\right)\;\mu\;+\;d\;\left(1+d\;\left(-1+m\right)\;\right)^{2}\;\left(-1+n\right)\;\mu^{2}\;\right)\;+\;b\;\left(-d\;m^{2}\;+\;\mu\;+\;d\;\left(-2+m\;\left(2+m\right)\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;\left(-2+m-m\;n\right)\;\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n\right)\;\mu\;+\;d\;\left(1+m\;n
                                                                                                                                                                                                           \left(-\left(1+d\left(-1+m\right)\right)^{2}+\left(2+2d\left(-2+m\right)+d^{2}\left(2+\left(-2+m\right)m\right)\right)n\right)\mu^{2}\right)\right)
                                                                                                    ((-1+d) \mu (1+(-1+n) \mu) - m (-1+\mu) (1+d (-1+n) \mu))^2
```

Here the formulas are more complicated, so we first concentrate on the initial changes, i.e., on changes when m is close to 0.

#### Initial increase?

Close to m=0

$$\begin{aligned} & \log 29 = \ \, \text{dex0} = \ \, \text{dex} \ \, /. \ \, \text{m} \to 0 \ \, // \ \, \text{FullSimplify} \\ & \text{Out}_{[259]=} \ \, \left( (-1+p) \ \, p \, \delta \, (-1+\mu) \, \left( b + b \, (-1+2 \, n) \, \mu - c \, (1+n+(-1+n) \, \mu) \, \right) \right) \, / \, \left( \mu \, (1+(-1+n) \, \mu)^2 \right) \\ & \text{In}_{[260]:=} \ \, \text{muc0} = \ \, \text{Solve} \left[ \left( \text{dex0} == 0 \, , \, \mu \right] \, // \, \text{FullSimplify} \right] \\ & \text{Out}_{[260]:=} \ \, \left\{ \left\{ \mu \to 1 \right\} \, , \, \left\{ \mu \to \frac{-b+c+c\, n}{c-c\, n+b\, (-1+2\, n)} \right\} \right\} \\ & \text{In}_{[261]:=} \ \, \text{Solve} \left[ \left( \mu \, /. \, \, \text{muc0} \, [\![2]\!] \right) == 0 \, , \, b \right] \\ & \text{Out}_{[261]:=} \ \, \left\{ \left\{ b \to c \, (1+n) \, \right\} \right\} \\ & \text{In}_{[262]:=} \ \, \text{Limit} \left[ \left( \mu \, /. \, \, \text{muc0} \, [\![2]\!] \right) \, , \, b \to \infty \right] \\ & \text{Out}_{[263]:=} \ \, \text{Limit} \left[ \text{dex0} \, , \, \mu \to 0 \right] \\ & \text{Out}_{[263]:=} \ \, \left( -1+p \right) \, p \, \delta \, \text{DirectedInfinity} \left[ -b+c+c\, n \right] \end{aligned}$$

->  $E[\overline{X}]$  increases initially with m if  $\mu$ > $\mu$ c, and  $\mu$ c<0 if b>c(n+1).

In other words,

- if b>c(n+1),  $E[\overline{X}]$  increases initially with m for any value of  $\mu$ .
- otherwise, E[ $\overline{X}$ ] increases initially with m if  $\mu > \mu_c^{\text{BD}}$ , with  $\mu_c^{\text{BD}} = \frac{-b+c+c}{c-c} \frac{n}{n+b} \frac{-b+c+c}{(-1+2n)}$ .

With our parameters, b>c(n+1).

#### Maximum value of EX

$$\begin{aligned} & \text{In}_{[264]:=} \text{ mcs = Solve} \Big[ \text{dex == 0, m} \Big] \text{ // FullSimplify} \\ & \text{Out}_{[264]:=} \end{array} \Big\{ \Big\{ m \to \frac{1}{(-1+\mu)^2 \left( 1+d \left( -1+n \right) \, \mu \right)} \left( \left( -1+d \right) \, \left( -1+\mu \right) \, \mu \, \left( 1+ \left( -1+n \right) \, \mu \right) - \frac{1}{\left( b-c \right) \, d \, \left( -1+p \right)} \right. \\ & \left. \left( \sqrt{\left( -\left( b-c \right) \, \left( -1+d \right)^2 \, d \, \left( -1+p \right)^2 \, \left( -1+\mu \right)^2 \, \mu \, \left( c \, \left( 1+n \right) + c \, \mu \, \left( -2+d \, n^2 + \mu - n \, \mu \right) \right) + b \, \left( -1+\mu \, \left( 2-\mu +n \, \left( 2 \, \left( -1+\mu \right) +d \, \left( -1+(-1+n) \, \left( -2+\mu \right) \, \mu \right) \right) \right) \right) \right) \Big\} \Big\}, \\ & \left\{ m \to \frac{1}{\left( -1+\mu \right)^2 \, \left( 1+d \, \left( -1+n \right) \, \mu \right)} \left( \left( -1+d \right) \, \left( -1+\mu \right) \, \mu \, \left( 1+ \left( -1+n \right) \, \mu \right) + \frac{1}{\left( b-c \right) \, d \, \left( -1+p \right)} \right. \\ & \left. \left( \sqrt{\left( -\left( b-c \right) \, \left( -1+d \right)^2 \, d \, \left( -1+p \right)^2 \, \left( -1+\mu \right)^2 \, \mu \, \left( c \, \left( 1+n \right) + c \, \mu \, \left( -2+d \, n^2 + \mu - n \, \mu \right) + b \, \left( -1+\mu \, \left( 2-\mu +n \, \left( 2 \, \left( -1+\mu \right) +d \, \left( -1+(-1+n) \, \left( -2+\mu \right) \, \mu \right) \right) \right) \right) \right) \right) \right\} \Big\} \end{aligned}$$

-> The admissible solution is the first one (note (-1+p) at the denominator). This is the critical value of m, at which the maximum value of  $E[\overline{X}]$  is attained. Its formula is given by

In[265]:= mmax = m /. mcs[[1]] // FullSimplify

$$\frac{1}{(-1+\mu)^2 \left(1+d \ (-1+n) \ \mu\right)} \left(\left(-1+d\right) \ (-1+\mu) \ \mu \ (1+(-1+n) \ \mu) - \frac{1}{\left(b-c\right) \ d \ (-1+p)} \right) \\ \left(\sqrt{\left(-\left(b-c\right) \ \left(-1+d\right)^2 \ d \ (-1+p)^2 \ (-1+\mu)^2 \ \mu \ \left(c \ (1+n) + c \ \mu \ \left(-2+d \ n^2 + \mu - n \ \mu\right) + b \ \left(-1+\mu \left(2-\mu+n \ \left(2 \ (-1+\mu) + d \ (-1+(-1+n) \ \left(-2+\mu\right) \ \mu\right) \right) \right) \right) \right) \right) \right)} \right)$$

Numerically check threshold value, i.e. that = 0 when  $\mu$  = muc (formula too big to simplify...)

```
myRound[x] := Round[x, 12];
mmax /. muc0[2] /. \{b \rightarrow 2, c \rightarrow 1, d \rightarrow 15, n \rightarrow 4, p \rightarrow 0.45\} // myRound
mmax /. muc0[2] /. \{b \rightarrow 4, c \rightarrow 1, d \rightarrow 15, n \rightarrow 4, p \rightarrow 0.45\} // myRound
mmax /. muc0[2] /. \{b \rightarrow 4, c \rightarrow 1, d \rightarrow 2, n \rightarrow 4, p \rightarrow 0.45\}
```

Out[326]= 0

Out[327]= **0** 

Out[328]= 0.

Check value for low mutation

In[266]:= Limit[mmax,  $\mu \rightarrow 0$ ]

Out[266]= 0

-> When  $\mu$  -> 0, this argmax gets closer to 0: at the limit,  $E[\overline{X}]$  just decreases with m.

#### With our parameters,

```
In[267]:= mfig = mmax /. figparms;
        \{\{"\mu", 0.001, 0.01, 0.1, 0.25\}, \{"m_{max}", mfig /. \mu \rightarrow 0.001, \}
              mfig /. \mu \rightarrow 0.01, mfig /. \mu \rightarrow 0.1, mfig /. \mu \rightarrow 0.25}} // Transpose // MatrixForm
```

Out[268]//MatrixForm=

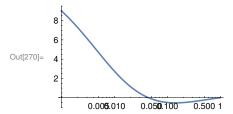
```
m_{\text{max}}
0.001 0.0825309
        0.18545
 0.1
        0.350698
0.25
```

And the maximum value attained by  $E[\overline{X}]$  is

$$ln[269] := exmax = ex /. m \rightarrow mmax;$$

It seems that (exmax - p) is positive when  $\mu < \mu C$  and negative otherwise, but the formula is too complicated so cannot show this.

$$\begin{aligned} & \text{ln}[270] \coloneqq \text{ LogLinearPlot}\Big[\frac{\text{exmax} - \text{p}}{\delta} \text{ /. } \Big\{ \text{b} \rightarrow \text{10, c} \rightarrow \text{1, d} \rightarrow \text{15, n} \rightarrow \text{4, p} \rightarrow \text{0.45, } \delta \rightarrow \text{0.005} \Big\}, \\ & \{\mu, \, 0, \, 1\}, \, \text{PlotRange} \rightarrow \text{All, ImageSize} \rightarrow \text{Small} \Big] \end{aligned}$$



# WF life-cycle, changes with m

# Indirect/secondary term

$$\begin{aligned} & \text{In}[235] \coloneqq \ \textbf{bi} = \beta \textbf{WFI} \ / \cdot \ \Big\{ \textbf{Qin} \rightarrow \textbf{QinWF}, \ \textbf{Qout} \rightarrow \textbf{QoutWF} \Big\} \ / \cdot \ \textbf{mychange} \ / / \ \textbf{FullSimplify} \\ & \text{Out}[235] = \ \left( \ (-1 + \mu) \ \left( \ (2 + d \ (-2 + m) \ \right) \ m - 2 \ \left( 1 + d \ (-1 + m) \ \right)^2 \ \mu + \left( 1 + d \ (-1 + m) \ \right)^2 \ \mu^2 \right) \right) \ / \\ & \left( \ \left( -1 + d \right)^2 \ \left( -2 + \mu \right) \ \mu \ (-1 + (-1 + n) \ \left( -2 + \mu \right) \ \mu \right) - \\ & 2 \ \left( -1 + d \right) \ m \ \left( -1 + \mu \right)^2 \ \left( -1 + d \ (-1 + n) \ \left( -2 + \mu \right) \ \mu \right) + d \ m^2 \ \left( -1 + d \ (-1 + n) \ \left( -2 + \mu \right) \ \mu \right) \right) \end{aligned}$$

Derivative with respect to m

In[237]:= Solve[dbi == 0, m] // FullSimplify

$$\text{Out[237]= } \left\{ \left\{ m \rightarrow \frac{-1+d}{d} \right\} \right\}$$

ln[238]:= dbi /. m  $\rightarrow 0$  // FullSimplify

Out[238]= 
$$\frac{2 n (-1 + \mu)}{(-1 + (-1 + n) (-2 + \mu) \mu)^2}$$

 $\rightarrow \beta$ WFI decreases until m =  $\frac{d-1}{d}$ , then increases.

#### EX

In[239]:= ex = EXWF // ApplyParms;

Derivative with respect to *m* 

In[240]:= dex = D[ex, m] // FullSimplify

$$\begin{array}{l} \text{Out} [240] = \end{array} \left( 2 \, \left( -1 + d \right)^3 \, \left( 1 + d \, \left( -1 + m \right) \right) \, n \, \left( -1 + p \right) \, p \, \delta \, \left( -2 + \mu \right)^2 \, \left( -1 + \mu \right) \, \mu \, \left( c + b \, \left( -2 + \mu \right) \, \mu \right) \right) \, \left/ \left( \left( -1 + d \right)^2 \, \left( -2 + \mu \right) \, \mu \, \left( -1 + \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) - 2 \, \left( -1 + d \right) \, m \, \left( -1 + \mu \right)^2 \, \left( -1 + d \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \right)^2 \right) \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( 1 + d \, \left( -1 + n \right) \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) - 2 \, \left( -1 + d \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( 1 + d \, \left( -1 + n \right) \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( 1 + d \, \left( -1 + n \right) \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( 1 + d \, \left( -1 + n \right) \, \left( -1 + n \right) \, \left( -2 + \mu \right) \, \mu \right) \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \right)^2 \, , \\ & \left( 2 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \left( -1 + d \right)^3 \, \right$$

In[241]:= mcc = Solve[dex == 0, m] // FullSimplify

Out[241]= 
$$\left\{ \left\{ m \rightarrow \frac{-1+d}{d} \right\} \right\}$$

Second derivative with respect to *m*, evaluated at the critical *m* 

 $ln[242] = ddex = D[ex, \{m, 2\}] /. mcc[[1]];$ 

When does this second derivative change signs?

ln[243]:= Solve [ddex == 0,  $\mu$ ] // FullSimplify

$$\text{Out} [243] = \left\{ \left\{ \mu \to \mathbf{0} \right\} \text{, } \left\{ \mu \to \mathbf{1} \right\} \text{, } \left\{ \mu \to \mathbf{2} \right\} \text{, } \left\{ \mu \to \mathbf{2} \right\} \text{, } \left\{ \mu \to \mathbf{1} - \frac{\sqrt{b \left( b - c \right)}}{b} \right\} \text{, } \left\{ \mu \to \frac{b + \sqrt{b \left( b - c \right)}}{b} \right\} \right\}$$

It is either a minimum or a maximum depending on  $\mu$ . To know whether it is a min or a max, let's look at the initial change of EX with m, and see whether it is increasing (-> max) or decreasing (->min).

$$\begin{split} & \log_{[244]:=} \ \text{dex0} = \text{dex /. m} \to 0 \ / / \ \text{FullSimplify} \\ & \text{Solve[\% == 0, $\mu$]} \\ & \text{Limit[dex0, $\mu \to 0$]} \\ & \text{Out[244]=} \ - \frac{2 \ n \ (-1 + p) \ p \ \delta \ (-1 + \mu) \ \left(c + b \ (-2 + \mu) \ \mu\right)}{\mu \ \left(-1 + \left(-1 + n\right) \ \left(-2 + \mu\right) \ \mu\right)^2} \\ & \text{Out[245]=} \ \left\{ \left\{ \mu \to 1 \right\}, \ \left\{ \mu \to \frac{b - \sqrt{b^2 - b \ c}}{b} \right\}, \ \left\{ \mu \to \frac{b + \sqrt{b^2 - b \ c}}{b} \right\} \right\} \end{split}$$

Out[246]=  $n (-1+p) p \delta DirectedInfinity[c]$ 

-> - When 
$$\mu < \mu_c^{WF} = 1 - \frac{\sqrt{b(b-c)}}{b}$$
,

 $E[\overline{X}]$  reaches a minimum at  $m_c^{WF} = \frac{d-1}{d}$ , i.e., initially decreases with m.;

-Otherwise,  $E[\overline{X}]$  reaches a maximum at  $m_c^{WF} = \frac{d-1}{d}$ , i.e., initially increases with m.

With our parameters, the critical value of  $\mu$  is  $\mu_c^{WF}$ =

$$ln[247]$$
:= 1 -  $\frac{\sqrt{b(b-c)}}{b}$  /. figparms // N

Out[247]=

0.0339082