

# Lesson #12: More on Birth Death Simulations and M/G, G/M systems.

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## From Previous Lesson :

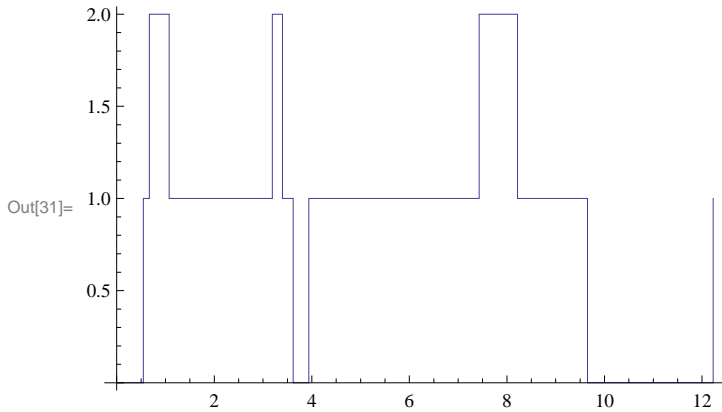
```
In[25]:= bdSim[birthFunction_, deathFunction_, timeHorizon_] :=
Module[{state = 0, time = 0.0, index = 1},
  rel = Table[{kuku, bobo},
    {Round[4 * 2 * (birthFunction[1] + deathFunction[1]) * timeHorizon]};
  (*rel={{time, state}};*)
  rel[[index++]] = {time, state};
  (*Now loop untill time > timeHorizon and append to rel as we go*)
  While[time < timeHorizon,
    birthRate = birthFunction[state];
    deathRate = deathFunction[state];
    time += RandomReal[ExponentialDistribution[birthRate + deathRate]];
    rel[[index++]] = {time, state};
    (*AppendTo[rel, {time, state}];*)

    state += 2 RandomInteger[BernoulliDistribution[ $\frac{\text{birthRate}}{\text{birthRate} + \text{deathRate}}$ ]] - 1;

    rel[[index++]] = {time, state};
    (*AppendTo[rel, {time, state}];*)
  ];
  Take[rel, index - 1]
]
```

## ■ M/M/1

```
In[26]:= λ = 0.4;
μ = 1.0;
mmlBirth[s_] := λ;
mmlDeath[s_] := If[s > 0, μ, 0];
rel = bdSim[mmlBirth, mmlDeath, 10];
ListPlot[rel, Joined → True]
```



## Different Timing Attempts

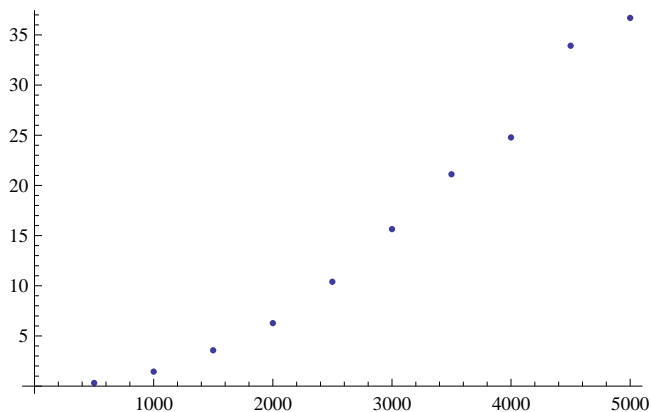
```
Table[{t, First[Timing[bdSim[mmlBirth, mmlDeath, t];]}], {t, 500, 5000, 500}}
{{500, 0.312}, {1000, 1.438}, {1500, 3.562}, {2000, 6.282}, {2500, 10.39},
{3000, 15.641}, {3500, 21.109}, {4000, 24.782}, {4500, 33.921}, {5000, 36.688}}
```

```
Table[{t, First[Timing[bdSim[mmlBirth, mmlDeath, t];]}], {t, 500, 5000, 500}}
{{500, 0.188}, {1000, 0.781}, {1500, 2.187}, {2000, 4.813}, {2500, 8.656},
{3000, 12.672}, {3500, 18.813}, {4000, 26.}, {4500, 32.531}, {5000, 38.172}}
```

```
Table[{t, First[Timing[bdSim[mmlBirth, mmlDeath, t];]}], {t, 500, 5000, 500}}
{{500, 0.125}, {1000, 0.219}, {1500, 0.328}, {2000, 0.422}, {2500, 0.547},
{3000, 0.672}, {3500, 0.765}, {4000, 0.907}, {4500, 0.968}, {5000, 1.11}}
```

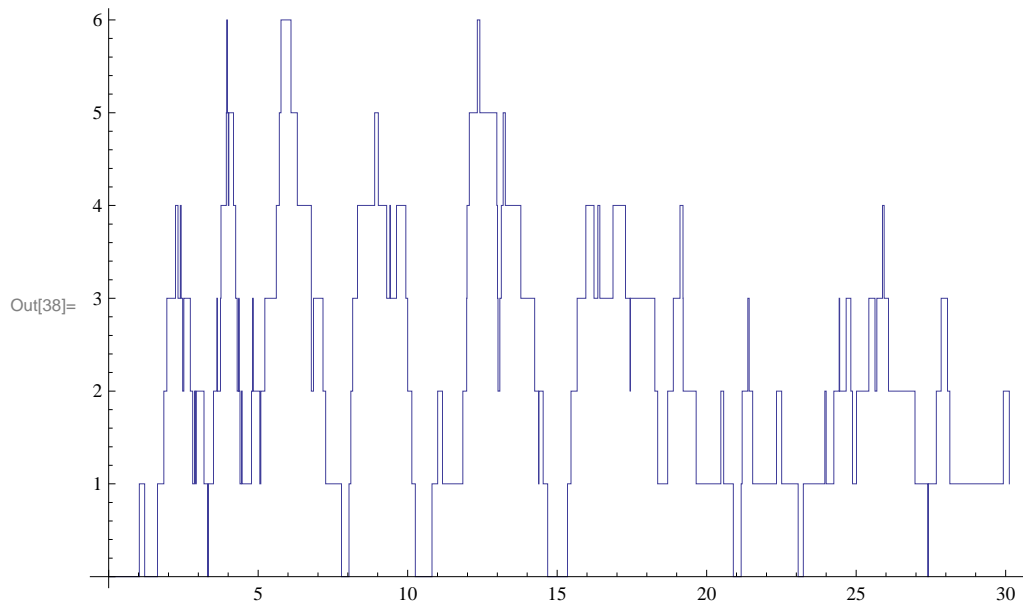
```
Table[{t, First[Timing[bdSim[mmlBirth, mmlDeath, t];]}], {t, 500, 5000, 500}}
{{500, 0.141}, {1000, 0.547}, {1500, 1.25}, {2000, 1.859}, {2500, 3.063},
{3000, 4.531}, {3500, 6.719}, {4000, 8.875}, {4500, 11.234}, {5000, 13.344}}
```

```
ListPlot[%]
```



## M/M/K/K (Erlang Loss System)

```
In[32]:=  $\lambda = 2.0;$   
 $\mu = 1.0;$   
 $KK = 8;$   
 $mm1Birth[s_] := If[s < KK, \lambda, 0];$   
 $mm1Death[s_] := \mu s;$   
 $rel = bdSim[mm1Birth, mm1Death, 30];$   
 $ListPlot[rel, Joined \rightarrow True]$ 
```



## Joint Class Exercise

### ■ 1) Collect Stationary Distribution from Simulation

```
In[39]:= bdSimWithStat[birthFunction_, deathFunction_, timeHorizon_] :=
Module[{state = 0, time = 0.0},
  rel = {{time, state}};
  histogramTable = Table[0.0, {100}];
  (*Now loop untill time > timeHorizon and append to rel as we go*)
  While[time < timeHorizon,
    birthRate = birthFunction[state];
    deathRate = deathFunction[state];
    stateDuration = RandomReal[ExponentialDistribution[birthRate + deathRate]];
    histogramTable[[state + 1]] += stateDuration;
    time += stateDuration;
    AppendTo[rel, {time, state}];

    state += 2 RandomInteger[BernoulliDistribution[ $\frac{\text{birthRate}}{\text{birthRate} + \text{deathRate}}$ ]] - 1;

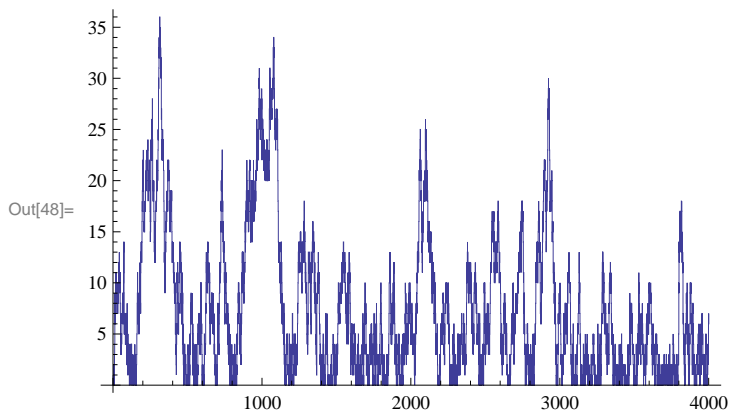
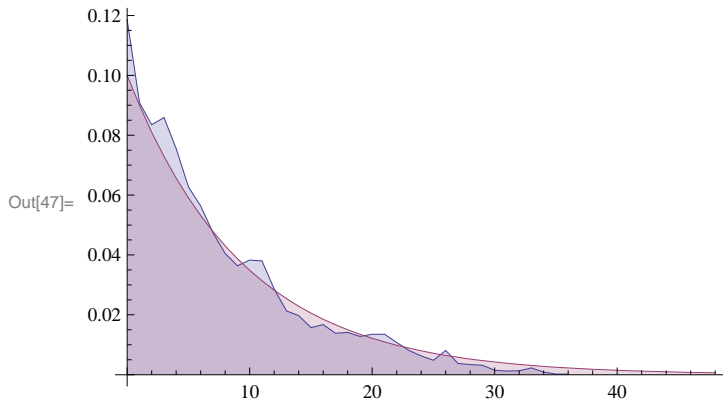
    AppendTo[rel, {time, state}];
  ];
  {rel,  $\frac{\text{histogramTable}}{\text{timeHorizon}}$ }
]
```

### ■ M/M/1 Histogram

```
In[40]:=  $\lambda = 0.9;$ 
 $\mu = 1.0;$ 
mmlBirth[s_] :=  $\lambda;$ 
mmlDeath[s_] := If[s > 0,  $\mu$ , 0];
out = bdSimWithStat[mmlBirth, mmlDeath, 4000];
hist = Select[Transpose[{Table[i, {i, 0, Length[out][[2]] - 1}], out[[2]]}], #[[2]] > 0 &];

theoreticalHist = Table[{i,  $\left(1 - \frac{\lambda}{\mu}\right) \left(\frac{\lambda}{\mu}\right)^i$ }, {i, 0, Round[1.3 * Length[hist]]};
```

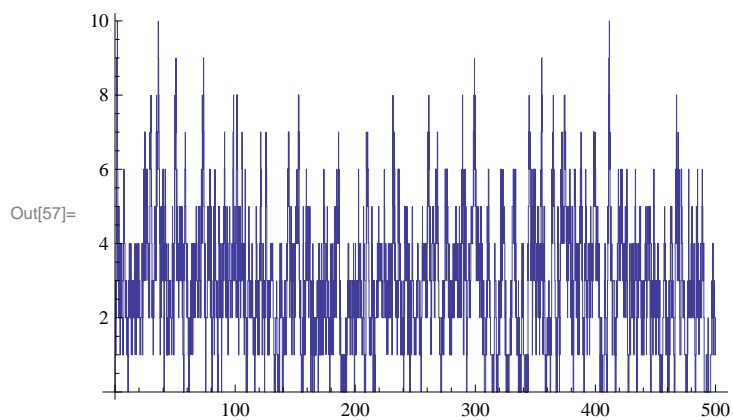
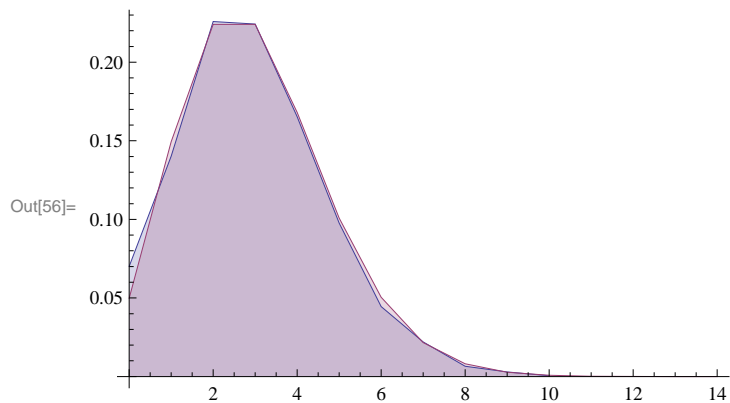
```
In[47]:= ListPlot[{hist, theoreticalHist}, Filling -> Axis,
  Joined -> True, PlotRange -> All, PlotStyle -> PointSize[0.02]]
ListPlot[out[[1]], Joined -> True]
```



## ■ M/M/∞ Histogram

```
In[49]:= λ = 3.0;
μ = 1.0;
mm1Birth[s_] := λ;
mm1Death[s_] := μ s;
out = bdSimWithStat[mm1Birth, mm1Death, 500];
hist = Select[Transpose[{Table[i, {i, 0, Length[out][[2]] - 1}], out[[2]]}], #[[2]] > 0 &];
theoreticalHist = Table[{i, E-λ/μ (λ/μ)i / i!}, {i, 0, Round[1.3 * Length[hist]]};
```

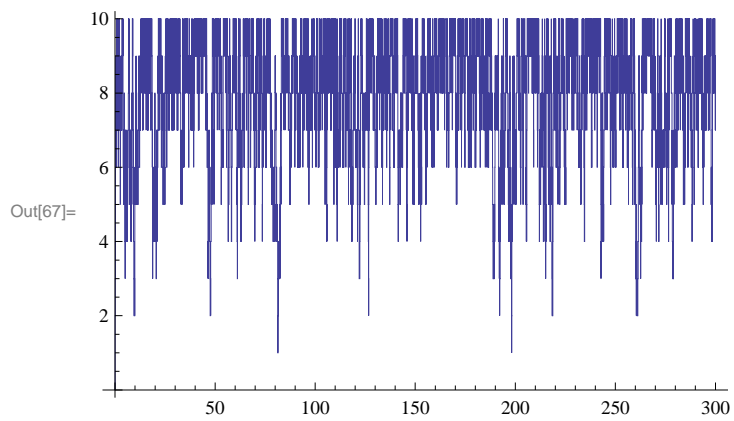
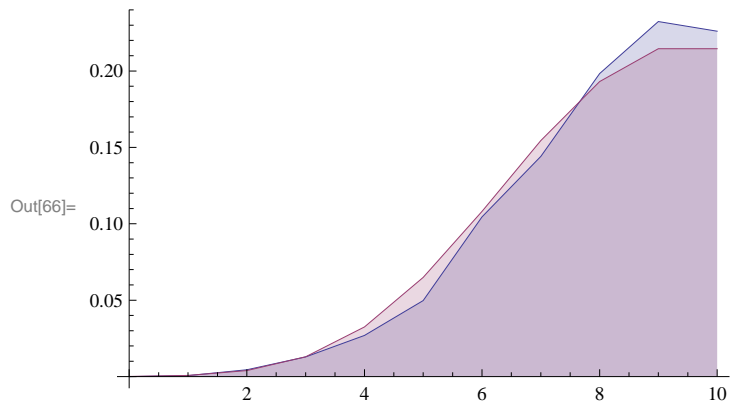
```
In[56]:= ListPlot[{hist, theoreticalHist}, Filling -> Axis,
  Joined -> True, PlotRange -> All, PlotStyle -> PointSize[0.02]]
ListPlot[out[[1]], Joined -> True]
```



## ■ M/M/K/K Histogram

```
In[58]:= λ = 10.0;
μ = 1.0;
K = 10;
mm1Birth[s_] := If[s < K, λ, 0];
mm1Death[s_] := μ s;
out = bdSimWithStat[mm1Birth, mm1Death, 300];
hist = Select[Transpose[{Table[i, {i, 0, Length[out[[2]]] - 1}], out[[2]]}], #[[2]] > 0 &];
theoreticalHist = Table[{i,  $\frac{1}{\text{Sum}[(\frac{\lambda}{\mu})^j / j!, \{j, 0, K\}]} \frac{(\lambda / \mu)^i}{i!}}$ }, {i, 0, K}];
```

```
In[66]:= ListPlot[{hist, theoreticalHist}, Filling -> Axis, Joined -> True,  
PlotRange -> All, PlotStyle -> PointSize[0.02], AxesOrigin -> {0, 0}]  
ListPlot[out[[1]], Joined -> True]
```



## ■ 2) Sojourn Times

```
In[68]:= bdSimWithStatAndSojourns[birthFunction_, deathFunction_, timeHorizon_] :=
Module[{state = 0, time = 0.0},
  rel = {{time, state}};
  sojournList = {};
  (*queue is a list of arrival times of customers*)
  queue = {};
  histogramTable = Table[0.0, {100}];
  (*Now loop untill time > timeHorizon and append to rel as we go*)
  While[time < timeHorizon,
    birthRate = birthFunction[state];
    deathRate = deathFunction[state];
    stateDuration = RandomReal[ExponentialDistribution[birthRate + deathRate]];
    histogramTable[[state + 1]] += stateDuration;
    time += stateDuration;
    AppendTo[rel, {time, state}];

    change = 2 RandomInteger[BernoulliDistribution[ $\frac{\text{birthRate}}{\text{birthRate} + \text{deathRate}}$ ]] - 1;

    state += change;
    If[change == 1,
      AppendTo[queue, time]
    ,
      (*Else change == -1*)
      AppendTo[sojournList, time - queue[[1]]];
      queue = Drop[queue, 1]
    ];
    AppendTo[rel, {time, state}];
  ];
  {rel,  $\frac{\text{histogramTable}}{\text{timeHorizon}}$ , sojournList}
]
```

```
In[69]:= Table[
  λ = 0.3;
  μ = 1.0;
  mmlBirth[s_] := λ;
  mmlDeath[s_] := If[s > 0, μ, 0];
  out = bdSimWithStatAndSojourns[mmlBirth, mmlDeath, 3000];
  out[[3]] // Mean,
  {10}]
```

```
Out[69]= {1.46791, 1.57294, 1.31035, 1.33803, 1.41529, 1.33298, 1.5891, 1.44209, 1.45477, 1.39011}
```

---

## The M/G/1 Queue - The Pollaczek-Khinchin Formulas

$$E[W] = \frac{\rho}{1-\rho} \frac{1}{2} (c_s^2 + 1) \frac{1}{\mu}$$

Stationary distribution of W and/or N is given in form of LSTs,

$$W^*(s) = \frac{(1-\rho)s}{\lambda G^*(s) + s - \lambda}$$



Similar formula for stationary distribution of Number in System

## The G/M/1 Queue

Here we need to solve the equation

$$\sigma = A^* (\mu - \mu \sigma)$$

The Queue length that an arriving customer sees is  $\text{Geometric}_0(\sigma)$

```
Clear[λ, μ, K]
```

$$A1[s_] := \frac{\lambda}{\lambda + s}$$

$$A2[s_] := \left( \frac{2\lambda}{2\lambda + s} \right)^2$$

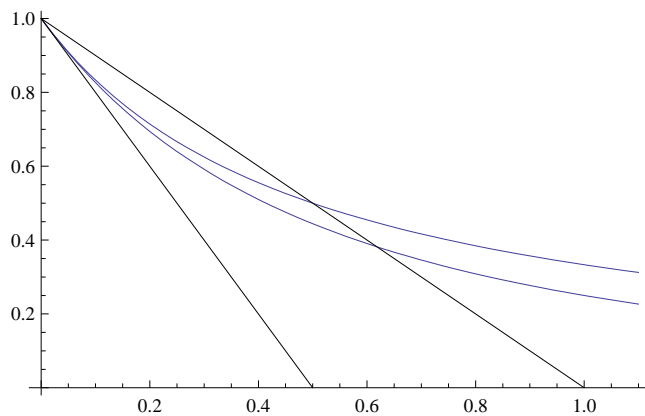
```
-D[A1[s], s] /. s -> 0
```

$$\frac{1}{\lambda}$$

```
-D[A2[s], s] /. s -> 0
```

$$\frac{1}{\lambda}$$

```
Plot[{A1[s], A2[s]} /. λ -> 1/2, {s, 0, 1.1},
  AxesOrigin -> {0, 0}, Epilog -> {Line[{{0, 1}, {1, 0}}],
  Line[{{0, 1}, {1/2, 0}}]}]
```



$$A[s_] := \left( \frac{k\lambda}{k\lambda + s} \right)^k$$