

## All Experiments using Languerre Polynomial as Basis Functions

[[1. 1.09 1.08 1.34]  
 [1. 1.16 1.26 1.54]  
 [1. 1.22 1.07 1.03]  
 [1. 0.93 0.97 0.92]  
 [1. 1.11 1.56 1.52]  
 [1. 0.76 0.77 0.9 ]  
 [1. 0.92 0.84 1.01]  
 [1. 0.88 1.22 1.34]]

Cash Flow at time  $t = 3$ :

Cash-flow matrix at time 3			
Path	$t = 1$	$t = 2$	$t = 3$
1	—	—	.00
2	—	—	.00
3	—	—	.07
4	—	—	.18
5	—	—	.00
6	—	—	.20
7	—	—	.09
8	—	—	.00

At time  $t = 2$

Coefficients = [-3094.53010697, 5713.89537929, -3773.67662635, 1223.18245248]

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.02	0.0133869	1.	0.02
2	0.0	0.	0.	0.
3	0.03	0.05010429	0.	0.0659232
4	0.13	0.17319321	0.	0.1695168
5	0.0	0.	0.	0.
6	0.33	0.18910104	1.	0.33
7	0.26	0.08276497	1.	0.26
8	0.0	0.	0.	0.

### Cash Flow matrix at time t=2

Path	t=1	t=2	t=3
1	--	0.02	0.0
2	--	0.0	0.0
3	--	0.0	0.7
4	--	0.0	0.0
5	--	0.0	0.0
6	--	0.33	0.0
7	--	0.26	0.0
8	--	0.0	0.0

### At time t = 1

#### Coefficients :

[ -9091.91659795, 16794.05861997, -11103.23289512, 3606.65973536]

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.01	0.01839949	0	0.0188352
2	--	0.	0	0.
3	--	0.	0	0.06208383
4	0.17	0.21653033	0	0.15964414
5	--	0.	0	0.
6	0.34	0.31010703	1	0.34
7	0.18	0.17401594	1	0.18
8	0.22	0.01506496	1	0.22

### Cash flow matrix at time $t = 1$

Path	$t=1$	$t=2$	$t=3$
1	0.0	0.02	0.0
2	0.0	0.0	0.0
3	0.0	0.0	0.7
4	0.0	0.0	0.0
5	0.0	0.0	0.0
6	0.34	0.0	0.0
7	0.18	0.0	0.0
8	0.22	0.0	0.0

### Final Stopping Rule :

Paths	Time = 1	Time = 2	Time = 3
1	0	1.	0
2	0	0.	0
3	0	0.	1
4	0	0.	1
5	0	0.	0
6	1	0	0
7	1	0	0
8	1	0.	0

**Optimal Price = 0.11543189689036804 (In simple basis function it was 0.1144)**

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### Introducing the Gaussian Noise of Sigma = 0.2:

```
[[1.    1.11343978  1.13340296  1.36698591]
 [1.    1.19068048  1.41736844  1.78457611]
 [1.    1.23867356  1.17903336  1.04504003]
 [1.    1.03560851  1.13502242  1.3634956 ]
 [1.    1.1168677   1.85937596  1.70780791]
 [1.    0.779318    0.82099096  1.15783301]
 [1.    0.92590538  0.8445708   1.06621553]
 [1.    0.90475507  1.26372151  1.34264561]]
```

### Cash Flow matrix at time t = 3

Path	t=1	t=2	t=3
1	--	--	0.0
2	--	--	0.0
3	--	--	0.05175911
4	--	--	0.0
5	--	--	0.0
6	--	--	0.0
7	--	--	0.034
8	--	--	0.0

### At time t = 2

**Coefficients = [-3094.53010697, 5713.89537929, -3773.67662635, 1223.18245248]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.0	0	0.
2	0.0	0.0	0	0.
3	0.0	0.0	0	0.05175911
4	0.0	0.0	0	0.
5	0.0	0.0	0	0.
6	0.27900904	0.09065539	1	0.27900904
7	0.2554292	0.08260464	1	0.2554292
8	0.0	0.0	0	0.

**Cash flow matrix at time t = 2:**

Path	t=1	t=2	t=3
1	--	0.0	0.0
2	--	0.0	0.0
3	--	0.0	0.05175911
4	--	0.0	0.0
5	--	0.0	0.0
6	--	0.27900904	0.0
7	--	0.2554292	0.0
8	--	0.0	0.0

**At time t = 1**

**Coefficients : [ -9091.91659795, 16794.05861997, -11103.23289512, 3606.65973536]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.	0	0.
2	0.0	0.	0	0.
3	0.0	0.	0	0.04874466
4	0.065	0.38393835	0	0.
5	0.0	0.	0	0.
6	0.320682	0.1255111	1	0.320682
7	0.175	0.19920065	0	0.240553
8	0.19524493	0.10950071	1	0.19524493

**Cash flow matrix at time t = 1:**

Path	t=1	t=2	t=3
1	0.0	0.0	0.0
2	0.0	0.0	0.0
3	0.0	0.0	0.05175911
4	0.0	0.0	0.0
5	0.0	0.0	0.0
6	0.320682	0.0	0.0
7	0.0	0.2554292	0.0
8	0.19524493	0.0	0.0

### Final Stopping Rule :

Paths	Time = 1	Time = 2	Time = 3
1	0	0	0
2	0	0	0
3	0	0	1
4	0	0	0
5	0	0	0
6	1	0	0
7	0	0	1
8	1	0	0

### Manual Cross Checking : (Gamma = 0.94176)

Paths	diff1	Gamma * diff2	Gamma^2 * diff3	Stoping Rule
1	0.0	0.0	0.0	-
2	0.0	0.0	0.0	-
3	0.0	0.0	0.04873608	3
4	0.0606417157	0.0	0.0	1
5	0.0	0.0	0.0	-
6	0.302022432	0.262760	0.0	1
7	0.163960	0.24109056	0.03201984	2
8	0.183873	0.0	0.0	1

Optimal Price = 0.100000000000000009

Accuracy : 2 wrong prediction => 75 % accuracy

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**Gaussian Predicion with sigma = 0.6 :**

```
[[1.    1.20993179  1.75371182  1.96063962]
 [1.    1.26962438  2.2039869   1.87847896]
 [1.    1.87851098  1.37150358  1.31889186]
 [1.    1.17555113  1.44712196  1.55477263]
 [1.    1.42239849  2.25786685  1.61419144]
 [1.    1.21605533  0.89513254  2.00467478]
 [1.    1.58719376  2.93110567  1.43612848]
 [1.    1.23806832  1.38557408  1.66104208]]
```

**Cash Flow matrix at time t = 3**

Path	t=1	t=2	t=3
1	--	--	0.0
2	--	--	0.0
3	--	--	0.0
4	--	--	0.0
5	--	--	0.0
6	--	--	0.0
7	--	--	0.0
8	--	--	0.0

**At time t = 2**

**Coefficients = [-3094.53010697, 5713.89537929, -3773.67662635, 1223.18245248]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.0	0	0
2	0.0	0.0	0	0
3	0.0	0.0	0	0
4	0.0	0.0	0	0
5	0.0	0.0	0	0
6	0.20486746	0.11109279	1	0.20486746
7	0.0	0.0	0	0
8	0.0	0.0	0	0

## Cash Flow Matrix at time t=2

Path	t=1	t=2	t=3
1	--	0.0	0.0
2	--	0.0	0.0
3	--	0.0	0.0
4	--	0.0	0.0
5	--	0.0	0.0
6	--	0.20486746	0.0
7	--	0.0	0.0
8	--	0.0	0.0

At time t = 1

Coefficients : [ -9091.91659795, 16794.05861997, -11103.23289512, 3606.65973536]

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.0	0	0.0
2	0.0	0.0	0	0.0
3	0.0	0.0	0	0.0
4	0.0	0.0	0	0.0
5	0.0	0.0	0	0.0
6	0.0	0.0	0	0.19293598
7	0.0	0.0	0	0.0
8	0.0	0.0	0	0.0

Cash Flow at time t = 1

Path	t=1	t=2	t=3
1	0.0	0.0	0.0
2	0.0	0.0	0.0
3	0.0	0.0	0.0
4	0.0	0.0	0.0
5	0.0	0.0	0.0
6	0.0	0.20486746	0.0
7	0.0	0.0	0.0
8	0.0	0.0	0.0



**Final Stopping Rule :**

Paths	Time = 1	Time = 2	Time = 3
1	0	0	0
2	0	0	0
3	0	0	0
4	0	0	0
5	0	0	0
6	0	1	0
7	0	0	0
8	0	0	0

**Manual Cross Checking : (Gamma = 0.94176)**

Paths	diff1	Gamma * diff2	Gamma^2 * diff3	Stoping Rule
1	0.0	0.0	0.0	-
2	0.0	0.0	0.0	-
3	0.0	0.0	0.0	-
4	0.0	0.0	0.0	-
5	0.0	0.0	0.0	-
6	0.0	0.192966624	0.0	2
7	0.0	0.0	0.0	-
8	0.0	0.0	0.0	-

Optimal Price = 0.100000000000000009

**Accuracy : 0 wrong prediction => 100 % accuracy**

---

### Gaussian Predicion with sigma = 1 :

```
[[1.    2.48151885  1.50961896  2.09427441]
 [1.    2.05334654  1.60238537  3.52100738]
 [1.    1.66599697  1.63350074  1.33373645]
 [1.    1.92539639  1.98067561  0.96344852]
 [1.    2.27563194  2.68070282  3.18124507]
 [1.    1.44581574  1.7548213   1.76783921]
 [1.    2.07006125  1.29450447  1.1010486 ]
 [1.    1.41987375  5.48936929  3.22416844]]
```

### Cash Flow matrix at time t = 3

Path	t=1	t=2	t=3
1	--	--	0.0
2	--	--	0.0
3	--	--	0.0
4	--	--	0.13655148
5	--	--	0.0
6	--	--	0.0
7	--	--	0.0
8	--	--	0.0

### At time t = 2

Coefficients = [-3094.53010697, 5713.89537929, -3773.67662635, 1223.18245248]

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.0	0	0
2	0.0	0.0	0	0
3	0.0	0.0	0	0
4	0.0	0.0	0	0.12859872
5	0.0	0.0	0	0
6	0.0	0.0	0	0.0
7	0.0	0.0	0	0
8	0.0	0.0	0	0

### Cash Flow Matrix at time t=2

Path	t=1	t=2	t=3
1	--	0.0	0.0
2	--	0.0	0.0
3	--	0.0	0.0
4	--	0.0	0.12859872
5	--	0.0	0.0
6	--	0.0	0.0
7	--	0.0	0.0
8	--	0.0	0.0

At time t = 1

Coefficients : [ -9091.91659795, 16794.05861997, -11103.23289512, 3606.65973536]

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.0	0	0.0
2	0.0	0.0	0	0.0
3	0.0	0.0	0	0.0
4	0.0	0.0	0	0.12110913
5	0.0	0.0	0	0.0
6	0.0	0.0	0	0.0
7	0.0	0.0	0	0.0
8	0.0	0.0	0	0.0

### Cash Flow Matrix at time t=1

Path	t=1	t=2	t=3
1	0.0	0.0	0.0
2	0.0	0.0	0.0
3	0.0	0.0	0.0
4	0.0	0.0	0.12859872
5	0.0	0.0	0.0
6	0.0	0.0	0.0
7	0.0	0.0	0.0
8	0.0	0.0	0.0

**Final Stopping Rule :**

Paths	Time = 1	Time = 2	Time = 3
1	0	0	0
2	0	0	0
3	0	0	0
4	0	0	1
5	0	0	0
6	0	0	0
7	0	0	0
8	0	0	0

**Manual Cross Checking : (Gamma = 0.94176)**

Paths	diff1	Gamma * diff2	Gamma^2 * diff3	Stoping Rule
1	0.0	0.0	0.0	-
2	0.0	0.0	0.0	-
3	0.0	0.0	0.0	-
4	0.0	0.0	0.121109132	3
5	0.0	0.0	0.0	-
6	0.0	0.0	0.0	-
7	0.0	0.0	0.0	-
8	0.0	0.0	0.0	-

Optimal Price = 0.100000000000000009

**Accuracy : 0 wrong prediction => 100 % accuracy**

---

**Increasing the number of Paths to 16 : (8 extra paths added by an randomly generated path with variance of 0.1)**

**Longstaff Paper :**

```
[[1.    1.09    1.08    1.34    ]
 [1.    1.16    1.26    1.54    ]
 [1.    1.22    1.07    1.03    ]
 [1.    0.93    0.97    0.92    ]
 [1.    1.11    1.56    1.52    ]
 [1.    0.76    0.77    0.9     ]
 [1.    0.92    0.84    1.01    ]
 [1.    0.88    1.22    1.34    ]
 [1.    1.09972955 1.20984266 1.42786124]
 [1.    1.30282465 1.33379354 1.54642148]
 [1.    1.30811775 1.18827482 1.05821046]
 [1.    1.00225371 1.22542088 1.06681238]
 [1.    1.17592812 1.65280718 1.72744582]
 [1.    0.89931269 0.85576233 0.95650906]
 [1.    0.9397596  0.92159093 1.03515879]
 [1.    0.90082674 1.26323588 1.41475168]]
```

**A. Using Longstaff Coefficients:**

**Cash Flow Matrix at time t = 3:**

Path	t=3
1	0.0
2	0.0
3	0.7
4	0.18
5	0.0
6	0.2
7	0.09
8	0.0
9	0.0
10	0.0
11	0.042
12	0.034
13	0.0

14	0.144
15	0.065
16	0.0

**For time t=2:**

**Coefficients: [-2239.87598024, 4136.69651566, -2733.09043231, 887.0782914 ]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.02	0.0200694	0	0.
2	0.0	0.	0	0.
3	0.03	0.04641799	0	0.0659232
4	0.13	0.13890187	0	0.1695168
5	0.0	0.	0	0.
6	0.33	0.19323406	1	0.33
7	0.26	0.09520494	1	0.26
8	0.0	0.	0	0.
9	0.0	0.	0	0.
10	0.0	0.	0	0.
11	0.0	0.	0	0.03935572
12	0.0	0.	0	0.03125477
13	0.0	0.	0	0.
14	0.25	0.09275029	1	0.24423767
15	0.18	0.11817074	1	0.17840907
16	0.0	0.	0	0.

**Cash Flow Matrix at time t = 2:**

Paths	t=1	t=2	t=3
1	--	0	0.0
2	--	0	0.0
3	--	0	0.7
4	--	0	0.18
5	--	0	0.0
6	--	0.33	0.0

7	--	0.26	0.0
8	--	0	0.0
9	--	0	0.0
10	--	0	0.0
11	--	0	0.042
12	--	0	0.034
13	--	0	0.0
14	--	0.24423767	0.0
15	--	0.17840907	0.0
16	--	0	0.0

At time t = 1:

**Coefficients: [-1723.47923186, 3185.06486082, -2106.88623773, 686.66193793]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.01	0.00482983	1	1.0e-02
2	0.0	0.	0	0.0
3	0.0	0.	0	6.20838328e-02
4	0.17	0.12381877	1	1.70000000e-01
5	0.0	0.	0	0.0
6	0.34	0.30008027	1	3.40e-01
7	0.18	0.12288012	1	1.80e-01
8	0.22	0.12384664	1	2.20e-01
9	0.001	-0.0200075	1	2.70450e-04
10	0.0	0.	0	0.
11	0.0	0.	0	3.70636402e-02
12	0.1	0.11858584	0	2.94344950e-02 0.0
13	0.0	0.	0	0.
14	0.201	0.12198031	1	2.00687310e-01
15	0.16	0.12476732	1	1.60240400e-01
16	0.2	0.12196722	1	1.99173260e-01

**Cash Flow Matrix at time t = 1:**

Paths	t=1	t=2	t=3
1	0.01	0	0.0
2	0.0	0	0.0
3	0.0	0	0.7
4	0.17	0	0.0
5	0.0	0	0.0
6	0.34	0.0	0.0
7	0.18	0.0	0.0
8	0.22	0	0.0
9	0.001	0	0.0
10	0.0	0	0.0
11	0.0	0	0.042
12	0.0	0	0.034
13	0.0	0	0.0
14	0.201	0.0	0.0
15	0.16	0.0	0.0
16	0.2	0	0.0

**Optimal Price = 0.10000000000000009****Final Stopping Rule :**

Paths	t=1	t=2	t=3
1	1	0	0
2	0	0	0
3	0	0	1
4	1	0	1
5	0	0	0
6	1	1	1
7	1	1	1
8	1	0	0
9	1	0	0
10	0	0	0
11	0	0	1



12	0	0	1
13	0	0	0
14	1	1	1
15	1	1	1
16	1	0	0

---

### Gaussian Paths Prediction : (Noise of sigma = 0.2)

```
[[1.    1.23296184  1.09489692  1.69158642]
 [1.    1.36941351  1.44845597  1.60094919]
 [1.    1.226444    1.26601982  1.10929528]
 [1.    1.17058925  1.13467595  1.23638033]
 [1.    1.12599369  1.61979095  1.92744534]
 [1.    0.9406163   0.85613236  0.95730729]
 [1.    1.03080596  0.90414056  1.12997546]
 [1.    1.09451694  1.23393434  1.36329816]
 [1.    1.51070774  1.29510313  1.80364087]
 [1.    1.39559217  1.78477954  1.57052059]
 [1.    1.47210796  1.31940943  1.20264906]
 [1.    1.08651136  1.33196722  1.36624595]
 [1.    1.71249869  2.14646017  2.04578883]
 [1.    1.13143053  0.866616    1.24396573]
 [1.    1.05753806  1.11250837  1.09522624]
 [1.    0.9610716   1.4232594   1.46694658]]
```

### Cash Flow Matrix at time t = 3:

Path	t=3
1	0.0
2	0.0
3	0.0
4	0.0
5	0.0
6	0.143

7	0.0
8	0.0
9	0.0
10	0.0
11	0.0
12	0.0
13	0.0
14	0.0
15	0.00449574
16	0.0

**For time t=2:**

**Coefficients: [-2239.87598024, 4136.69651566, -2733.09043231, 887.0782914 ]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.00510308	-0.02670134	1	0.00510308
2	0.0	0.	0	0.
3	0.0	0.	0	0.
4	0.0	0.	0	0.
5	0.0	0.	0	0.
6	0.24386764	0.09275197	1	0.24386764
7	0.19585944	0.10850184	1	0.19585944
8	0.0	0.	0	0.
9	0.0	0.	0	0.
10	0.0	0.	0	0.
11	0.0	0.	0	0.
12	0.0	0.	0	0.
13	0.0	0.	0	0.
14	0.233384	0.09377458	1	0.233384
15	0.0	0.	0	0.00449574
16	0.0	0.	0	0.

**Cash Flow at time t=2:**

Path	t = 1	t=2	t=3
1	-	0.00510308	0.0
2	-	0.0	0.0
3	-	0.0	0.0
4	-	0.0	0.0
5	-	0.0	0.0
6	-	0.24386764	0.0
7	-	0.19585944	0.0
8	-	0.0	0.0
9	-	0.0	0.0
10	-	0.0	0.0
11	-	0.0	0.0
12	-	0.0	0.0
13	-	0.0	0.0
14	-	0.233384	0.0
15	-	0.0	0.00449574
16	-	0.0	0.0

**At time t = 1**

**Coefficients: [-1723.47923186, 3185.06486082, -2106.88623773, 686.66193793]**

Paths	Exercise	Continuation	Stopping Rule	Value
1	0.0	0.0	0	0.00480588
2	0.0	0.0	0	0.0
3	0.0	0.0	0	0.0
4	0.0	0.0	0	0.0
5	0.0	0.0	0	0.0
6	0.1593837	0.12484539	1	0.1593837
7	0.07	0.09990151	0	0.18445258
8	0.00548306	-0.00633468	1	0.00548306
9	0.0	0.0	0	0.0
10	0.0	0.0	0	0.0

11	0.0	0.0	0	0.0
12	0.01348864	0.0130286	1	0.01348864
13	0.0	0.0	0	0.0
14	0.0	0.0	0	0.21979172
15	0.05	0.06782495	0	0.00423391
16	0.1389284	0.12598221	1	0.1389284

### Cash Flow at time t=1:

Path	t = 1	t=2	t=3
1	0.0	0.00510308	0.0
2	0.0	0.0	0.0
3	0.0	0.0	0.0
4	0.0	0.0	0.0
5	0.0	0.0	0.0
6	0.1593837	0.0	0.0
7	0.0	0.19585944	0.0
8	0.00548306	0.0	0.0
9	0.0	0.0	0.0
10	0.0	0.0	0.0
11	0.0	0.0	0.0
12	0.01348864	0.0	0.0
13	0.0	0.0	0.0
14	0.0	0.233384	0.0
15	0.0	0.0	0.00449574
16	0.1389284	0.0	0.0

**Optimal Price Gaussian Noise : 0.10000000000000009**

### Final Stopping Rule :

Path	t = 1	t=2	t=3
1	0	1	0
2	0	0	0
3	0	0	0
4	0	0	0
5	0	0	0

6	1	0	0
7	0	1	0
8	1	0	0
9	0	0	0
10	0	0	0
11	0	0	0
12	1	0	0
13	0	0	0
14	0	1	0
15	0	0	1
16	1	0	0

**Manual Checking : (Gamma = 0.94176)**

Paths	diff1	Gamma * diff2	Gamma^2 * diff3	Stopping Rule
1	0.0	0.004805877	0.0	2
2	0.0	0.0	0.0	-
3	0.0	0.0	0.0	-
4	0.0	0.0	0.0	-
5	0.0	0.0	0.0	-
6	0.1593837	0.229664789	0.126828401	2
7	0.07	0.184452586	0.0	2
8	0.00548306	0.0	0.0	1
9	0.0	0.0	0.0	-
10	0.0	0.0	0.0	-
11	0.0	0.0	0.0	-
12	0.01348864	0.0	0.0	1
13	0.0	0.0	0.0	-
14	0.0	0.219791716	0.0	2
15	0.05	0.0	0.0039	3
16	0.1389284	0.0	0.0	1

**Accuracy : 1 wrong prediction => 93.75 % accuracy**

**Conclusion : Langerre polynomial giving better accuracy than Simple basis function**

