Valuation of Contingent Convertibles with Derivatives



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This thesis is dedicated to my parents for their love and support. Thank you!

Abstract

Financial crises have led to higher regulatory standards on the capital adequacy of banks. They are required to hold more capital with loss absorbance capacities on their balance sheet. In conjunction with this development, contingent convertible bonds (CoCos) have become an attractive instrument for banks to seek new capital. The defining characteristic of CoCos is the automatic conversion into common equity when a predetermined trigger is met. Loss absorbing capital is created, which instantly improves the capital structure of the distressed bank. However, the pricing of these hybrid instruments remains opaque. In this context, the thesis scrutinizes the valuation of CoCos. Three dominant approaches are examined: the structural approach in accordance to Pennacchi (2010), the credit derivatives approach and the equity derivatives approach both pursuant to De Spiegeleer and Schoutens (2011b). The application covers sensitivity analysis to further understand the dynamics of the different methodologies. Based on a case study the viability of those approaches is evaluated. Software is provided for further replication.

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Introduction and Motivation

- 1.1 Introduction
- 1.2 Literature Overview
- 1.3 Motivation
- 1.4 Methodology

Structure of CoCos

2.1 Description of CoCos

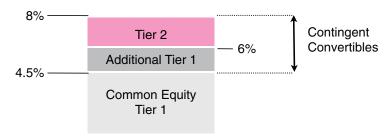


Figure 2.1: CoCos under Basel III (De Spiegeleer and Schoutens, 2011a)

2.2 Payoff and Risk Profile

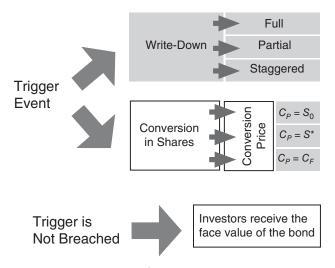


Figure 2.2: Anatomy of CoCos (De Spiegeleer and Schoutens, 2011a)

2.3 Conversion Trigger

- 2.3.1 Market Trigger
- 2.3.2 Accounting Trigger
- 2.3.3 Regulatory Trigger
- 2.3.4 Multivariate Trigger

2.4 Conversion Details

2.4.1 Conversion Fraction

- conversion fraction α
- \bullet face value N
- conversion amount $N \times \alpha$
- amount remaining in case of partial equity conversion $N \times (1 \alpha)$

2.4.2 Conversion Price and Ratio

- conversion rate C_r
- \bullet conversion price C_p
- recovery rate R_{CoCo}
- $\bullet\,$ stock price at trigger event S_T^*
- loss attributable to CoCo holders L_{CoCo}

$$C_p = \frac{\alpha N}{C_r} \tag{2.1}$$

$$C_r = \frac{\alpha N}{C_p} \tag{2.2}$$

$$R_{CoCo} = \frac{S_T^*}{C_p} \tag{2.3}$$

$$L_{CoCo} = N - (1 - R_{CoCo}) = N \left(1 - \frac{S_T^*}{C_p} \right)$$
 (2.4)

$$P_T = \begin{cases} (1 - \alpha)N + C_r S_T^* & \text{if converted} \\ N & \text{if not converted} \end{cases}$$
 (2.5)

Theory of Pricing

3.1 Credit Derivative Approach

3.1.1 Intensity-based Approach

$$p^* = 1 - \exp\left(-\lambda_{Triqger} \times T\right) \tag{3.1}$$

$$s_{CoCo} = (1 - R_{CoCo}) \times \lambda_{Trigger} = Loss_{CoCo} \times \lambda_{Trigger}$$
 (3.2)

$$Loss_{CoCo} = N - C_r \times S^* = N \left(1 - \frac{S^*}{C_P} \right)$$
 (3.3)

$$R_{CoCo} = \frac{S^*}{C_p} \tag{3.4}$$

$$p^* = \Phi\left(\frac{\log\left(\frac{S^*}{S}\right) - \mu T}{\sigma\sqrt{T}}\right) + \left(\frac{S^*}{S}\right)^{\frac{2\mu}{\sigma^2}} \Phi\left(\frac{\log\left(\frac{S^*}{S}\right) + \mu T}{\sigma\sqrt{T}}\right)$$
(3.5)

$$\lambda_{Trigger} = -\frac{\log(1 - p^*)}{T} \tag{3.6}$$

$$s_{CoCo} = -\frac{\log(1 - p^*)}{T} \times \left(1 - \frac{S^*}{C_p}\right) \tag{3.7}$$

3.1.2 Application to CoCos

3.1.3 Data Requirements and Calibration

3.1.4 Pricing Example

3.2 Equity Derivative Approach

Sources: Erismann (2015), De Spiegeleer and Schoutens (2011b)

$$P_{T} = \mathbb{1}_{\{\tau > T\}} N + \left[(1 - \alpha) N + \frac{\alpha N}{C_{p} S^{*}} \right] \mathbb{1}_{\{\tau \le T\}}$$

$$= N + \left[\frac{\alpha N}{C_{p}} S^{*} - \alpha N \right] \mathbb{1}_{\{\tau \le T\}}$$

$$= N + \left[C_{r} S^{*} - \alpha N \right] \mathbb{1}_{\{\tau \le T\}}$$

$$= N + C_{r} \left[S^{*} - \frac{\alpha N}{C_{r}} \right] \mathbb{1}_{\{\tau \le T\}}$$

$$= N + C_{r} \left[S^{*} - C_{p} \right] \mathbb{1}_{\{\tau \le T\}}$$

$$V_t^{ed} = V_t^{cb} - V_{t_i}^{dibi} + V_t^{difwd} (3.8)$$

3.2.1 Corporate Bonds

$$V_t^{cb} = \sum_{i=t}^{T} c_i \exp(-rt_i) + N \exp[-r(T-t)]$$
(3.9)

3.2.2 Binary Options

$$V_t^{dibi}(c_i, S^*, t) = \alpha \sum_{i=1}^k c_i \exp(-rt_i) \left[\Phi\left(-x_{1i} + \sigma\sqrt{t_i}\right) + \left(\frac{S^*}{S_t}\right)^{2\lambda - 2} \Phi\left(y_{1i} - \sigma\sqrt{t_i}\right) \right]$$
(3.10)

with

$$x_{1i} = \frac{\log\left(\frac{S_t}{S^*}\right)}{\sigma\sqrt{t_i}} + \lambda\sigma\sqrt{t_i}$$
$$y_{1i} = \frac{\log\left(\frac{S^*}{S_t}\right)}{\sigma\sqrt{t_i}} + \lambda\sigma\sqrt{t_i}$$
$$\lambda = \frac{r - q + \frac{\sigma^2}{2}}{\sigma^2}$$

3.2.3 Down-And-In Forward

$$\max(S_T - K) \text{ if } \min_{0 \le t \le T} (S_T) \le S^*$$
(3.11)

$$\max(K - S_T) \text{ if } \min_{0 \le t \le T} (S_T) \le S^*$$
(3.12)

$$V_t^{dic}(S_t, S^*, K) = S_t \exp\left[-q(T-t)\right] \left(\frac{S^*}{S_t}\right)^{2\lambda} \Phi(y)$$
$$-K \exp\left[-r(T-t)\right] \left(\frac{S^*}{S_t}\right)^{2\lambda-2} \Phi\left(y - \sigma\sqrt{T-t}\right)$$
(3.13)

with

$$K = C_p$$

$$y = \frac{\log\left(\frac{S^{*2}}{S_t K}\right)}{\sigma \sqrt{T - t}} + \lambda \sigma \sqrt{T - t}$$

$$\lambda = \frac{r - q + \frac{\sigma^2}{2}}{\sigma^2}$$

$$V_t^{dip}(S_t, S^*, K) = S_t \exp\left[-q(T-t)\right] \left(\frac{S^*}{S_t}\right)^{2\lambda} \left[\Phi(y) - \Phi(y_1)\right]$$

$$- K \exp\left[-r(T-t)\right] \left(\frac{S^*}{S_t}\right)^{2\lambda - 2} \left[\Phi\left(y - \sigma\sqrt{T-t}\right) - \Phi\left(y_1 - \sigma\sqrt{T}\right)\right]$$

$$+ K \exp\left[-r(T-t)\right] \Phi\left(x_1 + \sigma\sqrt{T-t}\right)$$

$$- S_t \exp\left[-q(T-t)\right] \Phi(-x_1)$$
(3.14)

with

$$x_1 = \frac{\log\left(\frac{S_t}{S^*}\right)}{\sigma\sqrt{T-t}} + \lambda\sigma\sqrt{T-t}$$
$$y_1 = \frac{\log\left(\frac{S^*}{S_t}\right)}{\sigma\sqrt{T-t}} + \lambda\sigma\sqrt{T-t}$$

$$\min(S_t) \le S^* : P_T = S_T - K = \max(S_T - K) - \max(K - S_T)$$
 (3.15)

$$\min(S_t) > S^* : P_T = 0 \tag{3.16}$$

$$V_t^{difwd} = C_r \left[S_t \exp\left[-q\left(T - t\right)\right] \left(\frac{S^*}{S_t}\right)^{2\lambda} \Phi\left(y_1\right) - K \exp\left[-r\left(T - t\right)\right] \left(\frac{S^*}{S_t}\right)^{2\lambda - 2} \Phi\left(y_1 - \sigma\sqrt{T - t}\right) - K \exp\left[-r\left(T - t\right)\right] \Phi\left(-x_1 - \sigma\sqrt{T - t}\right) + S_t \exp\left[-q\left(T - t\right)\right] \Phi\left(-x_1\right) \right]$$

$$(3.17)$$

with

$$C_r = \frac{\alpha N}{C_p} \tag{3.18}$$

- 3.2.4 Data Requirements and Calibration
- 3.2.5 Pricing Example
- 3.3 Structural Approach
- 3.3.1 Synthetic Balance Sheet
- 3.3.2 Data Requirements and Calibration
- 3.3.3 Pricing Example

Dynamics and Sensitivity Analysis

- 4.1 Credit Derivative Approach
- 4.2 Equity Derivative Approach
- 4.3 Structural Approach

Empirical Analysis and Model Comparison

- 5.1 Data Description
- 5.1.1 Deutsche Bank
- 5.2 Model Parametrization
- 5.3 Model Comparison
- 5.3.1 Qualitative Analysis
- 5.3.2 Quantitative Analysis

Conclusion

Appendix A
Sample Title

Appendix B

Code - Credit Derivative Approach

The following source code is an implementation of the Credit Derivative Approach (De Spiegeleer and Schoutens, 2011b) written in R.

```
# Price of Contingent Convertible Bond
2 price_coco_cd <- function(t, T, S_t, S_star, C_p, c_i, r, N, q, sigma){
    spread_coco <- calc_spread_coco(t, T, S_t, S_star, C_p, r, q, sigma)
4
    V_t_{-coco} \leftarrow N * exp(-(r + spread_{-coco}) * (T - t))
     for (t in 1:T) {
       V_t_{-coco} \leftarrow V_t_{-coco} + c_i * exp(-(r + spread_{-coco}) * t)
9
10
    V_{-}t_{-}coco
11 }
12
13 # Calculation of Trigger Probability
14 calc_p_star <- function(t, T, S_t, S_star, r, q, sigma){
    p_star \leftarrow pnorm((log(S_star / S_t) - calc_mu(r, q, sigma) * (T - t)))
       (\operatorname{sigma} * \operatorname{sqrt}(T - t)) + (S_{\operatorname{star}} / S_{\operatorname{t}})^{2} * \operatorname{calc_mu}(r, q, \operatorname{sigma}) /
       sigma^2) * pnorm((log(S_star / S_t) + calc_mu(r, q, sigma) * (T - t
      )) / (sigma * sqrt(T - t)))
    p_star
16
17 }
19 # Calculation of Drift of Underlying
calc_mu \leftarrow function(r, q, sigma)
    mu < - \ r \ - \ q \ - \ sigma^2 \ / \ 2
22
23 }
25 # Spread of CoCo Bond
26 calc_spread_coco <- function(t, T, S_t, S_star, C_p, r, q, sigma){
    spread\_coco <- log(1 - calc\_p\_star(t, T, S\_t, S\_star, r, q, sigma))
      / (T - t) * (1 - S_star / C_p)
    spread_coco
31 # Pricing Example
```

price_coco_cd(t <- 0, T <- 5, S_t <- 40, S_star <- 20, C_p <- 25, c_i <- 7, r <- 0.03, N <- 100, q <- 0, sigma <- 0.3)

Appendix C

Code - Equity Derivative Approach

The following source code is an implementation of the Equity Derivative Approach (De Spiegeleer and Schoutens, 2011b) written in R.

```
# Price of Contingent Convertible Bond
2 price_coco_ed <- function(t, T, S_t, S_star, C_p, c_i, r, N, q, sigma,
      alpha){
    V_t_{ed} \leftarrow price_cb(t, T, c_i, r, N) - price_dibi(t, T, S_t, S_star, c_i)
      i, r, q, sigma, alpha) + price_difwd(t, T, S_t, S_star, C_p, r, N, q
      , sigma, alpha)
4
    return (V_t_ed)
5
6 }
8 # Price of Corporate Bond
_{9} price_cb <- function(t, T, c_i, r, N){
    V_t_c = V_t - cb < N * exp(-r * (T - t))
11
    for (t in 1:T){
12
    V_{-}t_{-}cb \leftarrow V_{-}t_{-}cb + c_{-}i * exp(-r * t)
13
15
    return (V_t_cb)
16
17 }
19 # Price of Binary Option
price_dibi <- function(t, T, S_t, S_star, c_i, r, q, sigma, alpha){
    V_t_dibi < 0
23
    i <- t
    k <- T
24
25
    for (i in 1:k) {
26
    V_t_dibi \leftarrow V_t_dibi + c_i * exp(-r * i) * (pnorm(-calc_x_1_i(S_t, S_t)) + (pnorm(-calc_x_1_i(S_t, S_t)))
      _star , sigma , r , q , i ) + sigma * sqrt(i)) + (S_star / S_t)^(2 * calc
      _{lambda(r, q, sigma) - 2)} * pnorm ( calc_y_1_i(S_t, S_star, sigma, r)
      , q, i) - sigma * sqrt(i)))
28
```

```
V_t_dibi <- alpha * V_t_dibi
30
31
               return (V_t_dibi)
32
33
34
35 # Price of Down-And-In Forward
price_difwd <- function(t, T, S_t, S_star, C_p, r, N, q, sigma, alpha){
               V_{-}t_{-}difwd <- \ calc_{-}conversion_{-}rate\left(C_{-}p\,,\ N,\ alpha\right)\ *\ (S_{-}t\ *\ exp\left(-\ q\ *\ (T_{-}t_{-})\right)
                        - t)) * (S_star / S_t) ^ (2 * calc_lambda(r, q, sigma)) * pnorm(
                     calc_y_1(t, T, S_t, S_{star}, r, q, sigma)) - C_p * exp(-r * (T - t))
                        * (S_star / S_t)^2 = (S_star /
                    1(t, T, S_t, S_{star}, r, q, sigma) - sigma * sqrt(T - t)) - C_p * exp
                    (-r * (T - t)) * pnorm(-calc_x_1(t, T, S_t, S_star, r, q, sigma) +
                        sigma * sqrt(T - t)) + S_t * exp(-q * (T - t)) * pnorm(- calc_x_1(T - t)) * pnorm(-calc_x_1(T 
                    t, T, S<sub>-</sub>t, S<sub>-</sub>star, r, q, sigma)))
38
                return (V_t_difwd)
39
40 }
41
42 # Calculation of Conversion Rate
43 calc_conversion_rate <- function(C_p, N, alpha){
               C_r \leftarrow alpha * N / C_p
                return (C<sub>-</sub>r)
46
47 }
48
49 # Calculation of additional Parameters
50 \operatorname{calc}_{-x_{-}1_{-}i} \leftarrow \operatorname{function}(S_{-}t, S_{-}star, \operatorname{sigma}, r, q, t_{-}i)
               sigma) * sigma * sqrt(t_i)
                return(x_1_i)
53
54
       calc_y_1_i \leftarrow function(S_t, S_star, sigma, r, q, t_i)
56
               57
                    sigma) * sigma * sqrt(t_i)
59
                return(y_1_i)
60 }
61
62 calc_lambda <- function(r, q, sigma){
               lambda \leftarrow (r - q + sigma^2 / 2) / sigma^2
63
64
                return (lambda)
65
66
67
       calc_x_1 \leftarrow function(t, T, S_t, S_star, r, q, sigma)
68
69
               x_1 \leftarrow log(S_t / S_star) / (sigma * sqrt(T - t)) + calc_lambda(r, q, t)
                    sigma) * sigma * sqrt(T - t)
70
               return(x_1)
71
72 }
73
```

```
74 calc_y_1 <- function(t, T, S_t, S_star, r, q, sigma){
75    y_1 <- log(S_star / S_t) / (sigma * sqrt(T - t)) + calc_lambda(r, q, sigma) * sigma * sqrt(T - t)

76    return(y_1)

78 }

79    # Pricing Example
81 price_coco_ed(t <- 0, T <- 5, S_t <- 40, S_star <- 20, C_p <- 25, c_i <- 7, r <- 0.03, N <- 100, q <- 0, sigma <- 0.3, alpha <- 1)</pre>
```

Appendix D

Code - Structural Approach

The following source code is an implementation of the Structural Approach (Pennacchi, 2010) written in R.

```
# Price of Contingent Convertible Bond
 {\tt price\_coco\_sa} \mathrel{<\!\!-} \mathsf{function}(T\ ,\ \mathsf{npath}\ ,\ \mathsf{rho}\ ,\ \mathsf{kappa}\ ,\ \mathsf{r\_bar}\,,\ \mathsf{r0}\,,\ \mathsf{sigma\_r}\,,
       mu_Y, sigma_Y, lambda, g, x_hat, b0, p, e_bar, sigma_x, x0_low, x0_
       \label{eq:high} \ \ high \;, \ \ x0\_nint \;, \ \ B, \ \ c\_low \;, \ \ c\_high \;, \ \ c\_nint \;) \; \{
     n < -T * 250
     dt \leftarrow T / n
5
     result <- sim_corrProcess(T, npath, rho, n, dt)
6
     dW_{-}1 \leftarrow result \$dW_{-}1
8
     dW_2corr <- result $dW_2corr
9
     r <- sim_interestrate(kappa, r_bar, r0, sigma_r, dW_2corr, n, npath,
10
       dt)
11
     V_t_sa \leftarrow get_price(npath, n, dt, dW_1, dW_2corr, r, mu_Y, sigma_Y, dt)
12
       lambda, g, x_hat, b0, p, e_bar, sigma_x, x0_low, x0_high, x0_nint, B
       , c_{low}, c_{high}, c_{nint}) * 100
     return (V_t_sa)
13
14 }
15
16 sim_corrProcess <- function(T, npath, rho, n, dt){
     vect \leftarrow c(1, rho, rho, 1)
17
     RHO <- matrix (vect, nrow = 2)
18
     chol_RHO \leftarrow t(chol(RHO))
19
     # Create two Brownian Motions
21
     dW_{-1} \leftarrow matrix(1, n, npath)
22
     dW_2 \leftarrow matrix(1, n, npath)
23
24
     for (j in 1:npath)
25
26
       dW_{-}1[ , j] \leftarrow rnorm(n) * sqrt(dt)
27
       dW_2[, j] \leftarrow rnorm(n) * sqrt(dt)
29
```

```
# Create Correlated Process based on Brownian Motions using Cholesky-
31
      Decomposition
    dW_2 corr \leftarrow matrix(1, n, npath)
32
    for (j in 1:npath)
33
    {
34
       for (i in 1:n)
35
36
         dW_{-}2 corr[i, j] \leftarrow dW_{-}1[i, j] * chol_RHO[2, 1] + dW_{-}2[i, j] * chol_RHO[2, 1]
37
     RHO[2, 2]
       }
38
    }
39
40
     return(list("dW_1" = dW_1, "dW_2corr" = dW_2corr))
41
42
44 # Create Interest Rate Process
45 sim_interestrate <- function(kappa, r_bar, r0, sigma_r, dW_2corr, n,
      npath, dt){
    r \leftarrow matrix(r0, n + 1, npath)
46
47
     for (j in 1:npath)
48
49
       for (i in 1:n)
51
         r[i+1, j] \leftarrow r[i, j] + kappa * (r_bar - r[i, j]) * dt + sigma_r
52
      * sqrt(r[i, j]) * dW_2corr[i, j]
53
    }
54
55
     return(r)
56
57
58
59 get_price <- function(npath, n, dt, dW_1, dW_2corr, r, mu_Y, sigma_Y,
      lambda, g, x_hat, b0, p, e_bar, sigma_x, x0_low, x0_high, x0_nint, B
      , c_{low}, c_{high}, c_{nint}
60
    c_fit_matrix <- matrix(0, x0_nint, length(lambda))</pre>
61
62
     for (w in 1: length (lambda))
63
64
      # Create parametres for jump process
65
       phi <- matrix(rbinom( n%*%npath, 1, dt * lambda[w]), n, npath)
66
       ln_Y <- matrix(rnorm(n\%*\%npath, mu_Y, sigma_Y), n, npath)
67
68
       b \leftarrow matrix(b0, n + 1, npath)
69
       x_bar0 < -1 + e_bar + p * b0
70
       x_bar < matrix(x_bar0, n + 1, npath)
71
72
       h \leftarrow matrix(1, n, npath)
73
74
75
       k \leftarrow \exp(mu_Y + 0.5 * sigma_Y^2) - 1
76
       c \leftarrow seq(c_low, c_high, length = c_nint)
       x0 \leftarrow seq(x0\_low, x0\_high, length = x0\_nint)
```

```
79
        for (l in 1:x0_nint) \# Wieso?
80
81
           for (m in 1:c_nint) # Wieso?
82
83
             x \leftarrow matrix(x0[1], n+1, npath)
84
             \ln x_0 \leftarrow \operatorname{matrix}(\log(x_0[1]), n+1, npath)
             ln_x \leftarrow ln_x0
86
             binom_c < -matrix(1,n+1,npath)
87
88
             for (j in 1:npath)
89
90
               for (i in 1:n)
91
92
                 d_1 < (ln_x[i, j] + mu_Y) / sigma_Y
                 d_2 \leftarrow d_1 + sigma_Y
94
95
                 h\,[\,i\;,\;\;j\,\,]\;\; < -\;\; lambda\,[\,w\,]\;\;*\;\; (\,pnorm\,(\;\;-\;\;d_{\,-}1\,)\;\; -\;\; exp\,(\,l\,n_{\,\,-}x\,[\,i\;,\;\;j\,\,]\,)\;\;*
96
       \exp(mu_Y + 0.5 * sigma_Y^2) * pnorm(-d_2))
97
                 b[i + 1, j] \leftarrow b[i, j] * exp(-g[w] * (exp(ln_x[i, j]) - x_-
98
       hat) * dt
                 ln_x[i + 1, j] \leftarrow ln_x[i, j] + ((r[i, j] - lambda[w] * k) -
100
        (r[i, j] + h[i, j] + c[m] * b[i, j]) / exp(ln_x[i, j]) - g[w] * (
       \exp(\ln_x[i, j]) - x_hat) - 0.5 * sigma_x^2) * dt + sigma_x * sqrt(dt)
       * dW_{-}1[i, j] + ln_{-}Y[i, j] * phi[i, j]
101
                 x[i + 1, j] \leftarrow \exp(\ln_{-}x[i + 1, j])
102
                 x_bar[i + 1, j] \leftarrow 1 + e_bar + p * b[i + 1, j]
104
                  if(x[i + 1, j] >= x_bar[i + 1, j] \&\& binom_c[i, j] > 0.5)
106
107
                    binom_c[i + 1, j] \leftarrow 1
108
                  }else
109
110
                    binom_c[i + 1, j] \leftarrow 0
112
               }
113
             }
114
115
             payments \leftarrow matrix (c(rep(c[m] * dt, n-1), B), n, npath) *
116
       binom_c[1:n,]
             for(j in 1:npath){
               for (i in 2:n) {
119
                  if(payments[i, j] = 0 \& p * b[sum(binom_c[, j]) + 1, j]
120
       <= x[sum(binom_c[ , j]) + 1, j] - 1)
121
                    payments[i, j] \leftarrow p * B
                    break
122
                  }
123
                  else if (payments [i, j] = 0 \& 0 < x [sum(binom_c[, j]) + 1,
124
        [j] - 1 & x[sum(binom_c[ , j]) + 1, j] - 1
```

```
]) + 1, j]) \{
                      payments[i, j] <- (x[sum(binom_c[, j]) + 1, j] - 1) * B /
125
         b \left[ sum \left( binom_c \left[ j \right] \right) + 1, j \right]
                      break
126
                   }
127
                   else {
                      payments[i, j] <- payments[i, j]
130
                }
131
              }
132
              vec_disc_v \leftarrow rep(0, npath)
133
              for (j in 1:npath)
134
135
                 \operatorname{disc}_{-v} <\!\!- 0
                 int_r < 0
138
                 for(i in 1:n)
139
140
                 {
141
                   int_r < -int_r + r[i, j] * dt
                   \operatorname{disc}_{v} \leftarrow \operatorname{disc}_{v} + \exp(-\operatorname{int}_{r}) * \operatorname{payments}[i, j]
142
143
                 vec_disc_v[j] \leftarrow disc_v
144
146
              V_t_sa \leftarrow mean(vec_disc_v)
147
148
              return(V_t_sa)
149
           }
150
151
152
153
154
155 # Pricing Example
price_coco_sa(T = 5, npath = 2, rho = -0.2, kappa = 0.114, r_bar =
        0.069, r0 = 0.035, sigma_r = 0.07, mu_Y = -0.01, sigma_Y = 0.02,
        lambda = c(1), g = c(0.5), x_hat = 1.1, b0 = 0.04, p = 1, e_bar = 0.04
        0.02, sigma_x = 0.02, x0_low = 1.15, x0_ligh = 1.15, x0_ligh = 1.15, x0_ligh = 1.0, B
         = 1, c_{low} = 0.05, c_{high} = 0.05, c_{nint} = 10
```

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