CCD ALGORITHM

Application to EU Style Factors ERC or RISK PARITY portfolios In Excel VBA

This short note is a direct application of the Juan-Carlos Richard and Thierry Roncalli article available on <u>ssrn</u>. The cyclical coordinate descent (CCD) they describe is a fantastic tool in that you can solve many convex optimization problems without the need for an optimiser/solver, just using an iterative algorithm.

We apply here the cyclical coordinate descent (CCD) algorithm to compute the weight of the ERC portfolio in an Excel VBA framework.

Note: We make no distinction between Equally Weighted Risk Contribution (ERC) and Risk Parity portfolios. Both define here a portfolio where all its components have the same budget of risk.

CCD Algorithm

In short going from the optimisation program of a Risk Budgeted portfolio

From a mathematical point of view, a risk budgeting (or RB) portfolio is defined as follows (Roncalli, 2013):

$$\begin{cases}
\mathcal{RC}_{i}(x) = b_{i}\mathcal{R}(x) \\
b_{i} > 0 \\
x_{i} > 0 \\
\sum_{i=1}^{n} b_{i} = 1 \\
\sum_{i=1}^{n} x_{i} = 1
\end{cases}$$

From differentiating the Lagrangian function they deduce an iterative algorithm to compute the RB weigths

$$x_{i}^{\star} = \frac{-\left(\Sigma x\right)_{i} + x_{i}\sigma_{i}^{2} + \sqrt{\left(\left(\Sigma x\right)_{i} - x_{i}\sigma_{i}^{2}\right)^{2} + 4\sigma_{i}^{2}b_{i}\sigma\left(x\right)}}{2\sigma_{i}^{2}}$$

Portfolio of EU Style Premia

We implement the CCD iterative algorithm in Excel VBA (see appendix for command lines).

We now have an efficient tools to compute easily the ERC portfolio in Excel.

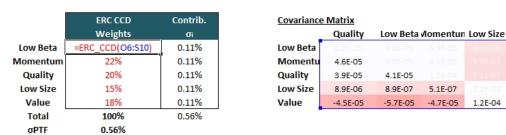
Let s illustrate this with a portfolio aiming at investing in 5 Style Premia on EU stocks. : Low Beta, Momentum, Quality, Low Size, Value. This can be easily extended to

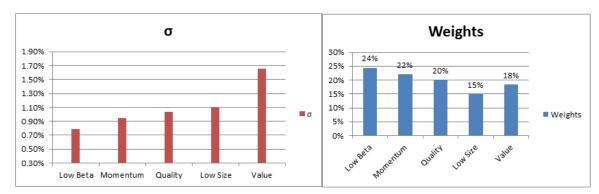
Below are the volatility and correlation matrix (weekly return, since 2011). We would note that the Value style premia presents interesting diversification properties counterbalancing its higher volatility.

_	Low Beta	Momentum	Quality	Low Size	Value
σ	0.79%	0.95%	1.03%	1.11%	1.65%
_	Quality	Low Beta	Momentum	Low Size	Value
Low Beta					-0.4
Momentum	0.6				-0.4
Quality	0.5	0.4			-0.3
Low Size	0.1	0.0	0.0		0.6
Value	-0.4	-0.4	-0.3	0.6	1.0

Excel VBA ERC_CCD() function

We can know compute the covariance matrix and the ERC portfolio using the ERC_CCD() function developed in VBA.





We'll note that despite a higher volatility the ERC portfolio would have a greater weight in Value vs. Low Size. This is due to the good diversification power of the Value factor.

Conclusion

We show here the command lines of the function to easily compute the ERC / Risk Parity portfolio in Excel.

We illustrate it by computing the ERC portfolio on 5 EU Equities Style Factors. This could be easily extended to any universe.

Value

Appendix: Excel VBA command Lines

```
Function ERC_CDD(COV_Mat, Optional Ret_Typ = 1, Optional Opt_MaxIte = 500, Optional Opt_Precision = 0.0000001)
   'Conversion of a Range to a Matrix/Array

If TypeName(COV_Mat) = "Range" Then COV_Mat = MatToArray(COV_Mat)

nR = UBound(COV_Mat, 1)
    'Variables declaration
   Dim n, i
Dim vol, mr, tr
Dim x: ReDim x(1 To nR, 1 To 1)
   Dim vol_i2: ReDim vol_i2(1 To nR, 1 To 1)
Dim Cov_i, L2_loN_t
    For i = 1 To nR
      'Asset i volatility^2
vol_i2(i, 1) = COV_Mat(i, i)
'Initialisation x0
   x(i, 1) = 1 / Sqr(vol_i2(i, 1))
Next i
   'Distance Portfolio RiskBudgets vs. the ERC target (RB = 1/N) L2_loN_t = L2_loN(w_TR(COV_Mat, x)) n = 1  
While (n <= Opt_MaxIte) And Not (L2_loN_t < Opt_Precision) Debug.Print n \epsilon" " \epsilon L2_loN_t
      For i = 1 To nR

vol = Application.WorksheetFunction.MMult(Application.WorksheetFunction.Transpose(x), Application.WorksheetFunction.MMult(COV_Mat, x))

vol = Sqr(vol(1))
            \begin{array}{lll} \texttt{Cov\_i} & \texttt{=} & \texttt{Application.WorksheetFunction.MMult}(\texttt{COV\_Mat, } \mathbf{x}) \\ \texttt{Cov\_i} & \texttt{=} & \texttt{Cov\_i}(\texttt{i}, \texttt{1}) \\ \end{array} 
      x(i, 1) = 1 / (2 * vol_i2(i, 1)) * (-Cov_i + x(i, 1) * vol_i2(i, 1) + Sqr((Cov_i - x(i, 1) * vol_i2(i, 1)) ^ 2 + 4 * vol_i2(i, 1) * vol / nR))
Next i
      L2_10N_t = w_TR_L2_10N(COV_Mat, x)
n = n + 1
   'portfolio volatility and Risk Contribution
    vol = Application.WorksheetFunction.MMult(Application.WorksheetFunction.Transpose(x), Application.WorksheetFunction.MMult(COV Mat, x))
    tr = w_TR(COV_Mat, x)
    'portfolio volatility and Risk Contribution
   If Ret_Typ = 1 Then ERC_CDD = x

If Ret_Typ = 2 Then ERC_CDD = vol(1)

If Ret_Typ = 3 Then ERC_CDD = tr
End Function
 Function w TR (MMat, x)
       "Compute the Risk Contribution (eg. Risk Budget) of a portfolio x knowing the CovVar matrix w_1R_0 = Application.WorksheetFunction.MMult(MMat, x)
      'Normalized by 100
      'Normalized by 100

"IR_SUM = Application.WorksheetFunction.Sum(w_TR_0)|
For I = LBound(w_TR_0) To UBound(w_TR_0)

"TR_0(1, 1) = w_TR_0(1, 1) / w_TR_SUM

Next 1

w_TR = w_TR_0
End Function
 Function L2_1oN(x)

L2_1oN = 0

If TypeName(x) = "Range" Then x = x.Value

nR = UBound(x)
       For Each c In x
            L2_{10N} = L2_{10N} + Abs(c - 1 / nR)
End Function
 Public Function MatToArray(R)
       Dim 1 As Integer
      Dim c
If VarType(R) = vbString Then Set R = Range(R)
      If Not TypeName(R) = "Range" Then
            MatToArray = R
            Dim R_Mod: ReDim R_Mod(1 To R.Rows.Count, 1 To R.Columns.Count)
            For Each c In R
               MatToArray = R_Mod
       End If
End Function
```

<u>Reference</u>

Richard, Jean-Charles and Roncalli, Thierry, Smart Beta: Managing Diversification of Minimum Variance Portfolios (March 2015). Available at SSRN: https://ssrn.com/abstract=2595051