

# Finance Quantitative

## Modèle de Black-Litterman Solution

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Version: 06 mars 2023

- Effectuer une lecture attentive de l'article de He et Litterman.
- A partir de la note de cours, reproduire les autres exemples de l'article, comparer les résultats avec ceux obtenus avec le package BLCOP.
- Comparer avec une allocation MV classique.

## Données

```
data =  
'1,0.4880,0.4780,0.5150,0.4390,0.5120,0.4910  
0.4880,1,0.6640,0.6550,0.3100,0.6080,0.7790  
0.4780,0.6640,1,0.8610,0.3550,0.7830,0.6680  
0.5150,0.6550,0.8610,1,0.3540,0.7770,0.6530  
0.4390,0.3100,0.3550,0.3540,1,0.4050,0.3060  
0.5120,0.6080,0.7830,0.7770,0.4050,1,0.6520  
0.4910,0.7790,0.6680,0.6530,0.3060,0.6520,1'  
  
Corrmat = matrix( as.double(spl( gsub('\n', ',', data), ',')),  
                  nrow = length(spl(data, '\n')), byrow=TRUE)  
  
stdevs = c(16.0, 20.3, 24.8, 27.1, 21.0, 20.0, 18.7)/100  
w.eq = c(1.6, 2.2, 5.2, 5.5, 11.6, 12.4, 61.5)/100  
# Prior covariance of returns  
Sigma = Corrmat * (stdevs %*% t(stdevs))
```

Calcul des rendements d'équilibre:

```
# risk aversion parameter  
delta = 2.5  
Pi = delta * Sigma %*% w.eq
```

## Fonction de calcul des poids optimaux

Table 1: Résumé des données de marché

| Assets    | $\sigma$ | $w_{eq}$ | $\Pi$ |
|-----------|----------|----------|-------|
| Australia | 16       | 1.6      | 3.9   |
| Canada    | 20.3     | 2.2      | 6.9   |
| France    | 24.8     | 5.2      | 8.4   |
| Germany   | 27.1     | 5.5      | 9     |
| Japan     | 21       | 11.6     | 4.3   |
| UK        | 20       | 12.4     | 6.8   |
| USA       | 18.7     | 61.5     | 7.6   |

```

bl.weights <- function(P, Q, tau.s, tau.o) {
  # one tau per view
  x = tau.o * diag(P %*% Sigma %*% t(P))
  Omega = diag(x, nrow=length(x))
  tau.Sigma.inv = solve(tau.s*Sigma)
  M.inverse = solve(tau.Sigma.inv + (t(P) %*% solve(Omega) %*% P))
  mu.bar = M.inverse %*% (tau.Sigma.inv %*% Pi + t(P) %*% solve(Omega) %*% Q)
  Sigma.bar = M.inverse + Sigma

  w.star = (1/delta) * solve(Sigma.bar) %*% mu.bar

  A = (1/tau.s)*Omega + 1/(1+tau.s) * P %*% Sigma %*% t(P)
  APS <- 1/(1+tau.s) * solve(A) %*% P %*% Sigma
  OIQ <- (tau.s/delta) * solve(Omega) %*% Q
  Lambda = OIQ - APS %*% w.eq - APS %*% t(P) %*% OIQ

  Hmisc::llist(mu.bar, w.star, Lambda)
}

```

## Point de vue 1: Le marché action Allemand surperforme le reste du marché action Européen de 5% par an.

Portefeuille exprimant le point de vue:

```

P.1 = matrix(c(0, 0, -29.5, 100, 0, -70.5, 0)/100, nrow=1)
Q.1 = 5/100
tau.s = 0.05
tau.o = 0.05

res <- bl.weights(P.1, Q.1, tau.s, tau.o)
df = data.frame(100*cbind(t(P.1), res$mu.bar, res$w.star, res$w.star-w.eq/(1+tau.s)))
df <- rbind(df, c(100*Q.1, rep(NA, 4)))
df <- rbind(df, c(100*res$Lambda[1], rep(NA, 4)))

row.names(df) = c(AssetNames, 'q', '$\\lambda \\times 100$')
names(df) = c('P', '$\\bar{\\mu}$', '$w^*$', '$w^* - \\frac{W_{eq}}{1+\\tau}$')

```

```
tmp <- kable(df, digits = 1, format="latex", booktabs=T, escape=F,
  caption="Solution avec PdV 1. P: matrice du PdV,  $\bar{\mu}$ : rendement ex-post,
   $w^*$ : poids optimaux,  $\frac{W_{eq}}{1+\tau}$ : poids ex-ante") %>%
  kable_styling(latex_options="HOLD_position")
kableExtra::row_spec(tmp, 7, hline_after = TRUE)
```

Table 2: Solution avec PdV 1. P: matrice du PdV,  $\bar{\mu}$ : rendement ex-post,  $w^*$ : poids optimaux,  $\frac{W_{eq}}{1+\tau}$ : poids ex-ante

|                      | P     | $\bar{\mu}$ | $w^*$ | $w^* - \frac{W_{eq}}{1+\tau}$ |
|----------------------|-------|-------------|-------|-------------------------------|
| Australia            | 0.0   | 4.3         | 1.5   | 0.0                           |
| Canada               | 0.0   | 7.6         | 2.1   | 0.0                           |
| France               | -29.5 | 9.3         | -3.9  | -8.9                          |
| Germany              | 100.0 | 11.0        | 35.4  | 30.2                          |
| Japan                | 0.0   | 4.5         | 11.0  | 0.0                           |
| UK                   | -70.5 | 7.0         | -9.5  | -21.3                         |
| USA                  | 0.0   | 8.1         | 58.6  | 0.0                           |
| q                    | 5.0   |             |       |                               |
| $\lambda \times 100$ | 31.7  |             |       |                               |

## Point de vue 2: le marché action Canadien surperforme le marché US de 3% par an.

### Solution Litterman & He

Portefeuille exprimant le point de vue:

```
P.2 = matrix(c(0, 100, 0, 0, 0, 0, -100)/100, nrow=1)
Q.2 = 3/100

P <- rbind(P.1, P.2)
Q <- matrix(c(Q.1, Q.2), nrow=2)
tau.o <- rep(0.05,2)
res <- bl.weights(P, Q, tau.s, tau.o)
df = data.frame(100*cbind(t(P), res$mu.bar, res$w.star, res$w.star-w.eq/(1+tau.s)))
df <- rbind(df, c(100*t(Q), rep(NA, 4)))
df <- rbind(df, c(t(100*res$Lambda), rep(NA, 4)))

row.names(df) = c(AssetNames, 'q', '$\\lambda \\times 100$')
names(df) = c('$P_1$', '$P_2$', '$\\bar{\\mu}$', '$w^*$', '$w^* - \\frac{W_{eq}}{1+\\tau}$')
tmp <- kable(df, digits = 1, format="latex", booktabs=T, escape=F,
  caption="Solution avec PdV 1 and 2.") %>%
  kable_styling(latex_options="HOLD_position")
kableExtra::row_spec(tmp, 7, hline_after = TRUE)
```

Table 3: Solution avec PdV 1 and 2.

|                      | $P_1$ | $P_2$  | $\bar{\mu}$ | $w^*$ | $w^* - \frac{W_{eq}}{1+\tau}$ |
|----------------------|-------|--------|-------------|-------|-------------------------------|
| Australia            | 0.0   | 0.0    | 4.4         | 1.5   | 0.0                           |
| Canada               | 0.0   | 100.0  | 8.7         | 41.9  | 39.8                          |
| France               | -29.5 | 0.0    | 9.5         | -3.4  | -8.4                          |
| Germany              | 100.0 | 0.0    | 11.2        | 33.6  | 28.3                          |
| Japan                | 0.0   | 0.0    | 4.6         | 11.0  | 0.0                           |
| UK                   | -70.5 | 0.0    | 7.0         | -8.2  | -20.0                         |
| USA                  | 0.0   | -100.0 | 7.5         | 18.8  | -39.8                         |
| q                    | 5.0   | 3.0    |             |       |                               |
| $\lambda \times 100$ | 29.8  | 41.8   |             |       |                               |

## Solution BLCOP

La solution obtenue en resolvant directement le portefeuille tangent avec les rendements et la matrice de covariance ex-post est globalement en accord avec le résultat de Litterman & He.

```
# rendement ex-ante
delta = 2.5
Pi = delta * Sigma %*% w.eq

# Point de vue
tau.pdv = 0.05

PDV.1 = matrix(c(0, 0, -29.5, 100, 0, -70.5, 0)/100, nrow=1)
colnames(PDV.1) <- AssetNames
# niveau de confiance
sd <- as.numeric(tau.pdv * PDV.1 %*% Sigma %*% t(PDV.1))
views <- BLViews(P = PDV.1, q = 0.05,
                  confidences = 1/sd,
                  assetNames = AssetNames)

PDV.2 = matrix(c(0, 100, 0, 0, 0, 0, -100)/100, nrow=1)
colnames(PDV.2) <- AssetNames
# niveau de confiance
sd <- as.numeric(tau.pdv * PDV.2 %*% Sigma %*% t(PDV.2))
views <- addBLViews(PDV.2, q = 0.03,
                    confidences = 1/sd,
                    views)

dist.expost <- posteriorEst(views=views, sigma=Sigma, mu=as.vector(Pi), tau=0.05)

mu <- dist.expost$posteriorMean
S <- dist.expost$posteriorCovar
res <- solve.QP(Dmat=S, dvec=rep(0, length(mu)), Amat=as.matrix(mu, ncol=1), bvec=1, meq=1)
w.QP <- round(100*res$solution/sum(res$solution),1)
df <- data.frame(w=w.QP)
row.names(df) <- AssetNames
names(df) <- "$w^* $"
kable(df, caption = "Portefeuille tangent avec BLCOP et solve.QP, incorporant les PDV 1 et 2",
```

```
format="latex", booktabs=T, escape=F) %>%
kable_styling(latex_options="HOLD_position")
```

Table 4: Portefeuille tangent avec BLCOP et solve.QP, incorporant les PDV 1 et 2

|           | $w^*$ |
|-----------|-------|
| Australia | 1.6   |
| Canada    | 44.0  |
| France    | -3.6  |
| Germany   | 35.3  |
| Japan     | 11.6  |
| UK        | -8.6  |
| USA       | 19.7  |

### Point de vue 3: Optimiste sur le marché action Canadien

Le seul changement est le paramètre  $q_2$ :

```
Q.2 = 4/100

Q <- matrix(c(Q.1, Q.2), nrow=2)

res <- bl.weights(P, Q, tau.s, tau.o)
df = data.frame(100*cbind(t(P), res$mu.bar, res$w.star, res$w.star-w.eq/(1+tau.s)))
df <- rbind(df, c(100*t(Q), rep(NA, 4)))
df <- rbind(df, c(t(100*res$Lambda), rep(NA, 4)))

row.names(df) = c(AssetNames, 'q', '$\\lambda \\times 100$')
names(df) = c('$P_1$', '$P_2$', "$\\bar{\\mu}$", '$w^*$', '$w^* - \\frac{W_{eq}}{1+\\tau}$')
tmp <- kable(df, digits = 1, format="latex", booktabs=T, escape=F,
  caption="Actions Allemandes surperforment de 4\\%" %>%
  kable_styling(latex_options="HOLD_position")
kableExtra::row_spec(tmp, 7, hline_after = TRUE)
```

Table 5: Actions Allemandes surperforment de 4%

|                      | $P_1$ | $P_2$  | $\bar{\mu}$ | $w^*$ | $w^* - \frac{W_{eq}}{1+\tau}$ |
|----------------------|-------|--------|-------------|-------|-------------------------------|
| Australia            | 0.0   | 0.0    | 4.4         | 1.5   | 0.0                           |
| Canada               | 0.0   | 100.0  | 9.1         | 53.3  | 51.3                          |
| France               | -29.5 | 0.0    | 9.5         | -3.3  | -8.2                          |
| Germany              | 100.0 | 0.0    | 11.3        | 33.1  | 27.8                          |
| Japan                | 0.0   | 0.0    | 4.6         | 11.0  | 0.0                           |
| UK                   | -70.5 | 0.0    | 7.0         | -7.8  | -19.6                         |
| USA                  | 0.0   | -100.0 | 7.3         | 7.3   | -51.3                         |
| q                    | 5.0   | 4.0    |             |       |                               |
| $\lambda \times 100$ | 29.2  | 53.8   |             |       |                               |

## Point de vue 4: Moindre confiance dans le PdV “Allemagne vs reste de l’Europe”

L'écart type du rendement du portefeuille 1 double ( $\tau = 0.1$ ):

```
tau.o <- c(0.1, .05)
res <- bl.weights(P, Q, tau.s, tau.o)
df = data.frame(100*cbind(t(P), res$mu.bar, res$w.star, res$w.star-w.eq/(1+tau.s)))
df <- rbind(df, c(100*t(Q), rep(NA, 4)))
df <- rbind(df, c(t(100*res$Lambda), rep(NA, 4)))

row.names(df) = c(AssetNames, 'q', '$\\lambda \\times 100$')
names(df) = c('$P_1$', '$P_2$', "$\\bar{\\mu}$", '$w^*$', '$w^* - \\frac{W_{eq}}{1+\\tau}$')
tmp <- kable(df, digits = 1, format="latex", booktabs=T, escape=F,
  caption="Moindre confiance dans le PdV 1.") %>%
  kable_styling(latex_options="HOLD_position")
kableExtra::row_spec(tmp, 7, hline_after = TRUE)
```

Table 6: Moindre confiance dans le PdV 1.

|                      | $P_1$ | $P_2$  | $\bar{\mu}$ | $w^*$ | $w^* - \frac{W_{eq}}{1+\tau}$ |
|----------------------|-------|--------|-------------|-------|-------------------------------|
| Australia            | 0.0   | 0.0    | 4.3         | 1.5   | 0.0                           |
| Canada               | 0.0   | 100.0  | 8.9         | 53.9  | 51.8                          |
| France               | -29.5 | 0.0    | 9.3         | -0.5  | -5.4                          |
| Germany              | 100.0 | 0.0    | 10.6        | 23.6  | 18.4                          |
| Japan                | 0.0   | 0.0    | 4.6         | 11.0  | 0.0                           |
| UK                   | -70.5 | 0.0    | 6.9         | -1.1  | -13.0                         |
| USA                  | 0.0   | -100.0 | 7.1         | 6.8   | -51.8                         |
| q                    | 5.0   | 4.0    |             |       |                               |
| $\lambda \times 100$ | 19.3  | 54.4   |             |       |                               |

## Ajout d’un point de vue redondant.

Le point de vue “Le marché action Canadien surperforme le marché Nippon de 4.12%” est implicite aux points de vue précédents. L’ajout du PdV ne change pas l’allocation.

```
P.3 = matrix(c(0, 100, 0, 0, -100, 0, 0)/100, nrow=1)
Q.3 = 4.12/100

P <- rbind(P.1, P.2, P.3)
Q <- matrix(c(Q.1, Q.2, Q.3), nrow=3)
tau.o <- c(0.1, .05, 0.05)
res <- bl.weights(P, Q, tau.s, tau.o)
df = data.frame(100*cbind(t(P), res$mu.bar, res$w.star, res$w.star-w.eq/(1+tau.s)))
df <- rbind(df, c(100*t(Q), rep(NA, 4)))
df <- rbind(df, c(t(100*res$Lambda), rep(NA, 4)))

row.names(df) = c(AssetNames, 'q', '$\\lambda \\times 100$')
```

```

names(df) = c('$P_1$', '$P_2$', '$P_3$', "$\\bar{\\mu}$", '$w^*$', '$w^* - \\frac{W_{eq}}{1+\\tau}$')
tmp <- kable(df, digits = 1, format="latex", booktabs=T, escape=F,
  caption="PdV redondant Canada/Japon.") %>%
  kable_styling(latex_options="HOLD_position")
kableExtra::row_spec(tmp, 7, hline_after = TRUE)

```

Table 7: PdV redondant Canada/Japon.

|                      | $P_1$ | $P_2$  | $P_3$  | $\bar{\mu}$ | $w^*$ | $w^* - \frac{W_{eq}}{1+\tau}$ |
|----------------------|-------|--------|--------|-------------|-------|-------------------------------|
| Australia            | 0.0   | 0.0    | 0.0    | 4.3         | 1.5   | 0.0                           |
| Canada               | 0.0   | 100.0  | 100.0  | 8.8         | 53.9  | 51.8                          |
| France               | -29.5 | 0.0    | 0.0    | 9.2         | -0.5  | -5.4                          |
| Germany              | 100.0 | 0.0    | 0.0    | 10.6        | 23.6  | 18.4                          |
| Japan                | 0.0   | 0.0    | -100.0 | 4.6         | 11.0  | 0.0                           |
| UK                   | -70.5 | 0.0    | 0.0    | 6.9         | -1.1  | -13.0                         |
| USA                  | 0.0   | -100.0 | 0.0    | 7.1         | 6.8   | -51.8                         |
| q                    | 5.0   | 4.0    | 4.1    |             |       |                               |
| $\lambda \times 100$ | 19.3  | 54.4   | 0.0    |             |       |                               |