

# ASSET PRICING - EMPIRICAL APPLICATION 1

## FACTORIAL MODEL AND RISK PREMIUM DECOMPOSITION - APT

Luis Miguel Fonseca  
Stéphane Eloundou Mvondo  
Natalia Cárdenas Frías

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### Introduction

Focusing on recent data from the French equity market, we want to better comprehend how the market prices systemic, non-diversifiable risk embedded in the risk premium of stocks, i.e. any expected compensation beyond the risk-free return. We base our analysis on a linear decomposition of said premium on different *factors* of risk in the spirit of the Arbitrage Pricing Theory (APT) pioneered by Ross [1976]. Unlike the CAPM model which considers a unique risk premium in the market, the Ross model gives a more detailed description of the pricing of aggregate risk by decomposing the contributions of different sources of risk. Here, a risky portfolio of  $j$  stocks<sup>1</sup> is compensated with  $k$  risk premia associated with the  $k$  *common factors* that the portfolio is exposed to.

## 1 Data and Framework

### 1.1 French stock market data

We decided to build a case study of the French market because it is a liquid and matured market, central in Europe. In the case of this analysis, we had trouble getting the data needed to perform it for other countries<sup>2</sup> and the fact that France has more publicly available data helped us choose it as our market of study.

We built a portfolio with 30 French stocks that we got from Yahoo Finance. Table 1 shows the companies that we used to create this portfolio, they are all publicly traded companies in France since the early 2000's in Euronext Paris. Since in the following, we try to implement a version of the Fama and French [1992] factor analysis, we restrain ourselves from choosing financial companies as the authors do due to their high leverage. Other than

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<sup>1</sup>Let  $j \in \{1, \dots, J\}$  with  $J$  sufficiently large so that all idiosyncratic risk can be fully diversified. We better explain the difference between idiosyncratic and aggregate in the context of the Ross model in Section 1.1

<sup>2</sup>Initially we thought about using data from the German market but we couldn't for instance find data for their inflation-linked bond yield that we use as an endogenous factor in Section 2.1.2

these two conditions, the choice of the companies was mainly restricted to data availability on public 'long' series on firm-level data, notably on market capitalization and book-to-market ratio to be able to incorporate the [Fama and French \[1992\]](#) factors to our analysis.

### describe frequency of data

Since we are interested in the underlying determinants of the risk premia, and due to data availability issues, we decided to have a broad analysis at the

| Company Name         | Ticker | Industry               |
|----------------------|--------|------------------------|
| Accor                | AC.PA  | Hospitality            |
| Air Liquide          | AI.PA  | Industrial Gases       |
| Air France-KLM       | AF.PA  | Airlines               |
| Airbus               | AIR.PA | Aerospace              |
| Biomerieux           | BIM.PA | Biotechnology          |
| BIC                  | BB.PA  | Consumer Goods         |
| Bouygues             | EN.PA  | Construction           |
| Capgemini            | CAP.PA | Information Technology |
| Carrefour            | CA.PA  | Retail                 |
| Casino               | CO.PA  | Retail                 |
| Dassault Aviation    | AM.PA  | Aerospace              |
| Danone               | BN.PA  | Food and Beverage      |
| Hermes International | RMS.PA | Fashion and Luxury     |
| JCDecaux             | DEC.PA | Advertising            |
| Kering               | KER.PA | Fashion and Luxury     |
| L'Oreal              | OR.PA  | Cosmetics              |
| LVMH                 | MC.PA  | Fashion and Luxury     |
| Michelin             | ML.PA  | Automotive             |
| Nexans               | NEX.PA | Electrical Equipment   |
| Orange               | ORA.PA | Telecommunications     |
| Renault              | RNO.PA | Automotive             |
| Saint-Gobain         | SGO.PA | Manufacturing          |
| Sanofi               | SAN.PA | Pharmaceuticals        |
| Sodexo               | SW.PA  | Food Services          |
| TF1                  | TFI.PA | Broadcasting           |
| Thales               | HO.PA  | Aerospace and Defense  |
| TotalEnergies        | TTE.PA | Energy                 |
| Ubisoft              | UBL.PA | Video Games            |
| Vinci                | DG.PA  | Construction           |
| Vivendi              | VIV.PA | Entertainment          |

Table 1: Synthetic portfolio: List of Companies, Tickers, and Industries

#### 1.1.1 Data description and sources

The other series that we use are the following:

- As a proxy for the free rate of the market we consider two measures:
  - The yield of short-term OAT, i.e. French treasuries taken from [Banque de France's website](#). As for most developed, stable countries, short-term sovereign bonds are taken as the risk-free asset as Governments are supposed to be more solvent than other agents in the economy, after all they decide

their income and could seize resources via taxes to meet their obligations.

- The spot yield curve spot rate, for 3-month maturity of all government bonds rated triple A in the Euro Area, retrieved from the [ECB webpage](#). On top of the fact that this is a measure for short-term sovereign bonds, we consider this to be a relevant proxy for the French market due to the strong integration within the European capital market. If an investor decides that the French market becomes risky, she can easily move her investments to another European capital market that looks safer.

## **1.2 Factorial model and multibeta relationship**

In the name of completeness, this section summarizes the lecture on the [Ross \[1976\]](#) model and the multibeta relationship as they are the theoretical foundation of the empirical application.

# **2 Empirical strategy and implementation**

## **2.1 Identify the risk factors**

### **2.1.1 Exogeneous factors**

### **2.1.2 Endogeneous factors**

### **2.1.3 French-Fama factors**

## **2.2 Estimate the $\beta_k$ coefficients from the factorial model**

## **2.3 Estimate the $\lambda_k$ parameters from the multibeta relationship**

## **2.4 Test the validity of the multibeta relationship**

## **Conslusion**

### 3 Data and Framework

That is, the return  $R_j$  of the  $j$ -th component of her portfolio can be described by the following expression  $\forall j \in \{1, \dots, N\}$ :

$$R_j = \mathbb{E}[R_j] + \underbrace{\sum_{k=1}^K \beta_{j,k} f_k}_{\text{Systemic risk}} + \overbrace{u_j}^{\text{Idiosyncratic risk}} \quad (1)$$

Where  $\mathbb{E}[R_j]$  is the expected return of asset  $j$ . The sources of risk are two-fold. The investor faces centered idiosyncratic risks  $u_j$ ,  $\mathbb{E}[u_j] = 0$  that are assumed to be completely diversifiable with a portfolio "large enough" ( $N$  big) because they are independent of each other  $u_j \perp u_{j'} \forall j \neq j'$ , and uncorrelated with aggregate risk  $\text{corr}(u_j, f_k) = 0, \forall j, k$  which is a required assumption to perform the estimations that will follow. She also faces  $k$  different sources of aggregate risk, modeled by the linear combination of  $f_k$  centered *shocks* that influence all  $R_j$  with a sensitivity  $\beta_{jk}$ . By definition, these risks cannot be diversified because they affect the returns of all asset and thus has to be compensated which is the focal point of our study.

#### 3.1 German Stock Market

We decided to consider the German stock market for this analysis because it is a major liquid stock market in Europe. It is also the biggest economy in the Europe, with mayor

#### 3.2 Estimation of the Factors

We need to choose what factors we are going to consider to generate risk premia that affect the return for the investor. In this section we examine the role of different types of factors (i) exogenous, (ii) endogeneous and we examine more closely the three-factor model proposed by [Fama and French \[1993\]](#) in (iii).

#### 3.3 Exogeneous Factors

These are risk factors that are supposed to be orthogonal to the portfolio itself. In particular, it is interesting to consider the role of

#### 3.4 Endogeneous Factors

#### 3.5 French-Fama Factors

[Fama and French \[1993\]](#) can be seen as an extension of the CAPM model. The authors show that the variation of the returns of an asset can be explained not only by the exposure to market risk as in the CAPM represented by the difference of the market return and the risk-free rate  $[R_M - R_f]$ , but also by a size and value premium in the following model.

$$R_j = \alpha_j + R_f + \beta_{m,j}[R_M - R_f] + \beta_S SMB + \beta_V HML + \varepsilon_j \quad (2)$$

The size premium refers to the observation that stocks with small market capitalizations tend to outperform stocks with larger ones and it is captured by the factor SMB, *small minus big*. It is computed as the difference in average returns of the 30% stocks with the smallest market capitalization and the average returns of the 30% stocks associated with the firms with the largest market capitalization. The value premium refers to the outperformance of "value stocks" i.e. those that have high book-to-market (B/M) and it is represented by the difference in an average return of the 50% of stocks with the highest  $B/M$  ratio (value stocks) and the 50% with lowest  $B/M$  ratio (growth stocks).

See K. French Data Library

## 4 Estimation of the exposure

## 5 Estimation of the market price of risk(s)

Consider a series of returns for different stock prices of at least 30 over a given period of time and frequency. The goal is to estimate risk premium by choosing a relevant so-called risk-free asset obtained as the return of treasury bond with relevant maturity

Develop econometric analysis which provides the multi-beta relationship 1. Identify the series for the risk factors (endo and exo) and justify choices + including 2 factors proposed by French and Fama 2. Estimate beta coefficients or different stocks with relevant linear regression 3. Estimate market price of different sources of risk retained in analysis with appropriate linear regression

Comment the results from a financial point of view: are the estimated exposures of the different stocks to the different factors in line with expectations

## References

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