# **Bond Clustering**



#### **Problem Statement**

A "Risk Stripe" is a group of traders who are collectively responsible for trading a set of Corporate Bonds. Only traders which belong to a given Risk Stripe could have the permissions to trade a bond mapped to that Risk Stripe. Each bond is uniquely mapped to a Risk Stripe, and hence, there is a many to one map of bonds to Risk Stripes which we call as "Risk Stripe Map".

In practice the Risk Stripe Map is correct for bonds that are traded actively in the market. However, overtime, as bonds mature or traders move between organizations, the mapping tends to become inaccurate. This is particularly true for bonds that are traded in less volume.

In this problem, you are given a training data set containing bonds (identified by "ISIN" Column), Bond Properties (attributes about the bond) and the corresponding Risk Stripe. You have to identify the set of bond properties that can be used for clustering similar bonds, and predict the correct Risk Stripe for each bond in the testing set.

## **Evaluation Strategy:**

The models will be evaluated in two stages:

- 1. Percentage of bonds mapped correctly (on Testing Data for Final Data Set Only)
- 2. Subjective evaluation of the model

Top teams will be selected based on the number of bonds mapped correctly. These teams will be independently evaluated on the model/strategy they have used.

### **Input Format**

You will be provided with **two sets of data** in the competition.

- 1. **Initial Data Set:** Given to you at the beginning of the competition. You can use this to build models/strategies for factor identification and clustering.
- 2. **Final Data Set:** This will be distributed **6** hours before the competition ends. Your model will be evaluated based on its performance on this dataset only.

Each Data Set will contain 2 csv delimited files:

- Training Data: Bond Data including correct Risk Stripe
- Testing Data: Bond Data excluding Risk Stripe

Note: Factors for clustering bonds may be different for Initial and Final Data Set.

### **Output Format**

Please upload the following in a single zip file:

- 1. A CSV file named "output.csv", containing the predictions of your model on the **Testing Data of the Final Data Set** given to you 6 hours before the competition closes.
- 2. All source code files (quoting any references you may have used)
- 3. A documentation of your solution. This can be in **PDF**, **PPTX**, **DOC** or **DOCX** formats. Do include the following aspects in your model doc:

- Assumptions
- Any mathematical simplifications/approximations
- Modelling choices and comments on appropriateness of answers
- Any plots/graphs which explain the process of your model selection

#### Note:

- 1. Please ensure consistency between output and the methodology you explain in model document.
- 2. If there are any additional ideas that you wish to include in the documentation which could not be implemented, please clearly mark them so.

## Sample Input

## **Training Data**

| ISIN   | SP_Rating  | Moody_Rating  | Currency  | Industry_Sector  | Industry_SubGroup  | Issuer_Name    | Ticker   | Country_Of_Domicile | Risk_Stripe |
|--------|------------|---------------|-----------|------------------|--------------------|----------------|----------|---------------------|-------------|
| ISINO  | sp rating0 | moody rating0 | Currency0 | Industry Sector0 | Industry SubGroup0 | Issuer NameO   | Ticker0  | Country0            | Stripe 0    |
| ISIN2  | sp rating2 | moody rating1 | Currency0 | Industry Sector1 | Industry SubGroup2 | Issuer Name2   | Ticker2  | Country0            | Stripe 0    |
| ISIN3  | sp rating2 | moody rating1 | Currency0 | Industry Sector1 | Industry SubGroup2 | Issuer Name2   | Ticker2  | Country0            | Stripe 0    |
| ISIN5  | sp rating3 | moody rating2 | Currency0 | Industry Sector3 | Industry SubGroup4 | Issuer Name4   | Ticker4  | Country1            | Stripe 0    |
| ISIN13 | sp rating1 | moody rating0 | Currency0 | Industry Sector0 | Industry SubGroup5 | Issuer Name6   | Ticker6  | Country2            | Stripe 1    |
| ISIN14 | sp rating1 |               | Currency0 | Industry Sector0 | Industry SubGroup5 | Issuer Name6   | Ticker6  | Country2            | Stripe 1    |
| ISIN18 | sp rating4 | moody rating3 | Currency0 | Industry Sector0 | Industry SubGroup0 | Issuer Name8   | Ticker7  | Country3            | Stripe 0    |
| ISIN19 | sp rating1 | moody rating4 | Currency0 | Industry Sector4 | Industry SubGroup6 | Issuer Name9   | Ticker8  | Country4            | Stripe 0    |
| ISIN20 | sp rating5 | moody rating5 | Currency0 | Industry Sector5 | Industry SubGroup7 | Issuer Name 10 | Ticker9  | Country5            | Stripe 2    |
| ISIN21 | sp rating5 | moody rating6 | Currency0 | Industry Sector4 | Industry SubGroup8 | Issuer Name11  | Ticker10 | Country4            | Stripe 0    |
| ISIN22 | sp rating6 | moody rating6 | Currency0 | Industry Sector4 | Industry SubGroup8 | Issuer Name 12 | Ticker11 | Country4            | Stripe 1    |
| ISIN23 | sp rating5 | moody rating6 | Currency0 | Industry Sector2 | Industry SubGroup9 | Issuer Name 13 | Ticker12 | Country6            | Stripe 0    |

## Download Initial Training Data

## **Testing Data**

| ISIN   | SP_Rating    | Moody_Rating    | Currency  | Industry_Sector  | Industry_SubGroup    | Issuer_Name    | Ticker   | Country_Of_Domicile |
|--------|--------------|-----------------|-----------|------------------|----------------------|----------------|----------|---------------------|
| ISIN26 | sp rating7   | moody rating8   | Currency0 | Industry Sector6 | Industry SubGroup 10 | Issuer Name 15 | Ticker14 | Country7            |
| ISIN28 | sp rating8   | moody rating8   | Currency0 | Industry Sector0 | Industry SubGroup11  | Issuer Name 16 | Ticker15 | Country7            |
| ISIN43 | sp rating6   |                 | Currency0 | Industry Sector0 | Industry SubGroup1   | Issuer Name 26 | Ticker23 | Country9            |
| ISIN44 | sp rating6   |                 | Currency0 | Industry Sector0 | Industry SubGroup1   | Issuer Name 26 | Ticker23 | Country9            |
| ISIN61 | sp rating6   | moody rating6   | Currency0 | Industry Sector5 | Industry SubGroup20  | Issuer Name42  | Ticker39 | Country4            |
| ISIN62 | sp rating6   | moody rating6   | Currency0 | Industry Sector5 | Industry SubGroup20  | Issuer Name42  | Ticker39 | Country4            |
| ISIN63 | sp rating6   | moody rating6   | Currency0 | Industry Sector5 | Industry SubGroup20  | Issuer Name 42 | Ticker39 | Country4            |
| ISIN64 | sp rating6   | moody rating6   | Currency0 | Industry Sector5 | Industry SubGroup20  | Issuer Name43  | Ticker39 | Country4            |
| ISIN67 | sp rating2   | moody rating9   | Currency0 | Industry Sector0 | Industry SubGroup 13 | Issuer Name45  | Ticker21 | Country5            |
| ISIN68 | sp rating2   | moody rating9   | Currency0 | Industry Sector0 | Industry SubGroup13  | Issuer Name45  | Ticker21 | Country4            |
| ISIN69 | sp rating 10 | moody rating 11 | Currency0 | Industry Sector1 | Industry SubGroup22  | Issuer Name46  | Ticker41 | Country4            |
| ISIN70 | sp rating6   | moody rating6   | Currency0 | Industry Sector0 | Industry SubGroup13  | Issuer Name47  | Ticker42 | Country5            |
| ISIN71 | sp rating6   | moody rating6   | Currency0 | Industry Sector0 | Industry SubGroup 13 | Issuer Name47  | Ticker42 | Country5            |
| ISIN72 | sp rating6   | moody rating6   | Currency0 | Industry Sector0 | Industry SubGroup13  | Issuer Name 47 | Ticker42 | Country5            |

## Download Initial Test Data

**Sample Output** 

Output.csv

| ISIN               | Risk_Stripe |
|--------------------|-------------|
| ISIN26             | Stripe 0    |
| ISIN28             | Stripe 0    |
| ISIN43             | Stripe 11   |
| ISIN44             | Stripe 11   |
| ISIN61             | Stripe 2    |
| ISIN62             | Stripe 2    |
| ISIN63             | Stripe 2    |
| ISIN64             | Stripe 2    |
| ISIN67             | Stripe 3    |
| ISIN68             | Stripe 3    |
| ISIN <del>G9</del> | Stripe 0    |
| ISIN70             | Stripe 3    |
| ISIN71             | Stripe 3    |
| ISIN72             | Stripe 3    |
| ISIN73             | Stripe 3    |

## **Explanation**

Output.csv should include only two columns (ISIN, Risk\_Stripe) in that order. The order for bonds should be same as the order in Test Data.