

FINAL TASK DATA SCIENTIST ID/X PARTNER - VIX RAKAMIN -**CREDIT RISK PREDICTION**

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"Have more than 11 years professional career in GIS and Management geodatabase. Good knowledge WebGIS Development, with strong experience Geospatial data in Forestry, environmental and regional planning. Skilled at data collection and analysis that elicits accurate and valuable information utilizing technical principles and theories. Technical proficiencies include SQL, Python, Machine Learning, MS Office, ESRI GIS, QGIS, HTML, CSS/Bootstrap, Javascript, geomorphology and Geospatial Software."

Overview



"Sebuah perusahaan di Indonesia ingin memprediksi *credit risk* untuk mengurangi risiko kredit macet, memaksimalkan dalam pengambilan keputusan pemberian kredit, mengetahui target pemberian kredit dan meminimalkan kerugian perusahaan. Oleh karena itu dibutuhkan analisis mendalam dari data yang telah tersedia yang kemudian dapat dikomunikasikan kepada pemangku kepentingan, managemen perusahaan bahkan bagian keuangan perusahaan. Sehingga perusahaan dapat menyalurkan kredit tepat kepada individu yang layak.

Dataset



```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 466285 entries, 0 to 466284
                                                                     initial list status
                                                                                                   466285 non-null
                                                                                                                    object
Data columns (total 75 columns):
                                                                                                                    float64
                                                                     out prncp
                                                                                                   466285 non-null
     Column
                                   Non-Null Count
                                                     Dtype
                                                                     out_prncp_inv
                                                                                                   466285 non-null
                                                                                                                    float64
                                                                     total pymnt
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     Unnamed: 0
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     member id
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                                                                     total rec int
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     loan amnt
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                                                    int64
                                                                     total_rec_late_fee
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                                                                     collection_recovery_fee
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     grade
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    sub_grade
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    home_ownership
                                   466285 non-null
                                                     object
                                                                  53 application_type
                                                                                                   466285 non-null
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    annual inc
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                                   466285 non-null
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     desc
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                                                     object
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    title
                                   466265 non-null
                                                     object
                                                                  63 open il 24m
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     zip_code
                                   466285 non-null
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     addr state
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     ing last 6mths
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    mths_since_last_deling
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                                                     float64
                                                                  70 all_util
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                                                                                                                    float64
                                   62638 non-null
    mths_since_last_record
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     open_acc
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                                                                  73 total_cu_tl
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    revol bal
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                                                                                                   0 non-null
                                                                                                                    float64
    revol util
                                   465945 non-null
                                                     float64
                                                                 dtypes: float64(46), int64(7), object(22)
 35 total acc
```

memory usage: 266.8+ MB

466256 non-null float64

Description

Dataset mengandung kebiasaan pinjam customer

Shape

75 Columns

Dtype

Float64 (46 features), int64(7 features), Object (22 features)

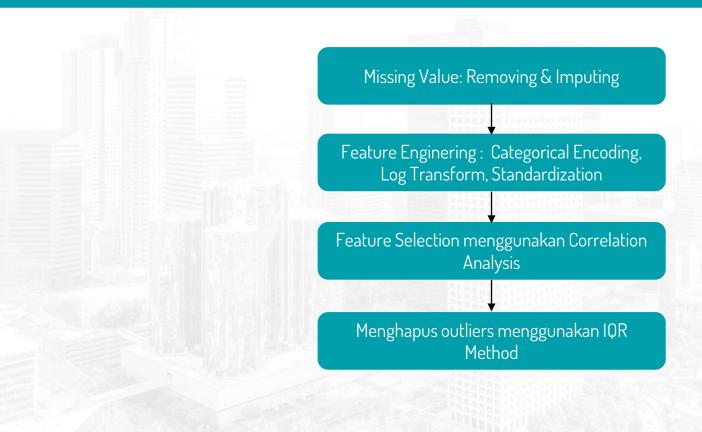
Missing Value

Banyak Missing Value, sehingga perlu drop 17 features

Untuk selengkapnya, dapat melihat jupyter notebook disini https://colab.research.google.com/drive/1uuPBOEkWOLnxp11-3tDSufuNeSS3GRFY?usp=sharing

Data Preparation





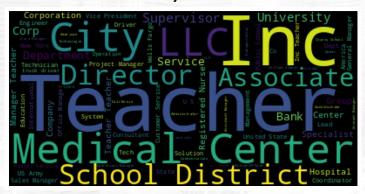
Exploratory Data Analysis



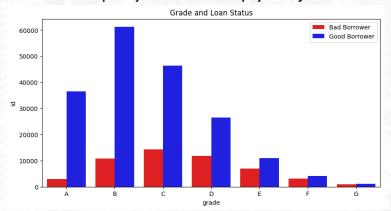
Target Variable

- Good Borrower (1): Fully Paid, Does not meet the credit policy. Status: Fully Paid
- Bad Borrower (0): Charged Off, Does not meet the credit policy. Status: Charged Off, Default, Late (31-120 days)
- Undetachable Loan (-1): Current, In Grace Period, Late (16-30 days)

Status Pekerjaan Nasabah



Bagaimana dengan mengklasifikasikan nilai peminjam kita dan status pinjamannya



Modeling and Evaluation



Modeling

- Training Test Split (70% Training, 30% Testing)
- Modeling menggunakan SMOTE (Synthetic Minority Over-sampling Technique) karena metode oversampling yang menghasilkan sampel sintetis untuk kelas minoritas dengan cara menggabungkan sampel dari kelas minoritas yang ada. Tujuan utama dari SMOTE adalah untuk meningkatkan kinerja model pada kelas minoritas dengan meningkatkan jumlah sampel yang ada dalam kelas tersebut. Hal ini membantu mencegah model pembelajaran mesin menjadi bias terhadap kelas mayoritas dan meningkatkan kemampuannya untuk memprediksi kelas minoritas dengan akurasi yang lebih tinggi.
- Semua Langkah dihandle dengan pipeline

Evaluation Metric

Model	FN	Recall	ROC-AUC	KS
Random Forest	608	96	99,41	94,4
Gradient Boosting Trees	386	97	99,48	94,28
XGBoost	447	97	99,43	93,83
Voting Classifier	420	97	99,48	94,34

Top 10 Features Importance



