Handling Strategies for Data Irregularities

| Handling Strategy | Data Quality Issue | Feature |
|---|---|--|
| Set -7s to NaN, and record -7 presence in new binary column | -7 special value | MSinceMostRecentInqexcl7days |
| Set -7s to NaN, and record -7 presence in new binary column | -7 special value | MSinceMostRecentDelq |
| Imputation | -8 special value | MSinceOldestTradeOpen |
| Imputation | -8 special value | MSinceMostRecentDelq |
| Imputation | -8 special value | MSinceMostRecentInqexcl7days |
| Imputation | -8 special value | NetFractionRevolvingBurden |
| Imputation | -8 special value | NetFractionInstallBurden |
| Imputation | -8 special value | NumRevolvingTradesWBalance |
| Imputation | -8 special value | NumInstallTradesWBalance |
| Imputation | -8 special value | NumBank2NatlTradesWHighUtilization |
| Imputation | -8 special value | PercentTradesWBalance |
| Remove affected rows | -9 special values | All features except RiskPerformance target feature |
| Remove affected rows | Higher values than NumTotalTrades | NumSatisfactoryTrades |
| Replace value | Special values with same meaning | MaxDelq2PublicRecLast12M |
| Remove column | Redundancy with NumTrades90Ever2DerogPubRec | NumTrades60Ever2DerogPubRec |
| Remove column | Rendundancy with NumInqLast6Mexcl7days | NumInqLast6M |
| Do nothing | Outliers | MSinceOldestTradeOpen |
| Do nothing | Outliers | MSinceMostRecentTradeOpen |
| S Do nothing | Outliers | AverageMInFile |
| S Do nothing | Outliers | NumSatisfactoryTrades |
| Do nothing | Outliers | NumTrades90Ever2DerogPubRec |
| Do nothing | Outliers | PercentTradesNeverDelq |
| Do nothing | Outliers | MSinceMostRecentDelq |
| S Do nothing | Outliers | NumTotalTrades |
| Do nothing | Outliers | NumTradesOpeninLast12M |
| Do nothing | Outliers | PercentInstallTrades |
| Do nothing | Outliers | MSinceMostRecentInqexcl7days |
| Do nothing | Outliers | NumInqLast6Mexcl7days |
| Do nothing | Outliers | NetFractionRevolvingBurden |
| Do nothing | Outliers | NumRevolvingTradesWBalance |
| S Do nothing | Outliers | NumInstallTradesWBalance |
| S Do nothing | Outliers | NumBank 2 Natl Trades W High Utilization |
| S Do nothing | Outliers | PercentTradesWBalance |
| | | |

Cleaned Data Results:

Continuous Features

| | count | mean | std | min | 25% | 50% | 75% | max |
|------------------------------------|-------|------------|-----------|------|-------|-------|-------|-------|
| ExternalRiskEstimate | 887.0 | 71.644870 | 9.781076 | 44.0 | 64.0 | 71.0 | 80.0 | 92.0 |
| MSinceOldestTradeOpen | 887.0 | 195.778815 | 89.158499 | 7.0 | 137.5 | 185.0 | 250.0 | 538.0 |
| MSinceMostRecentTradeOpen | 887.0 | 9.202931 | 12.199687 | 0.0 | 3.0 | 6.0 | 11.0 | 184.0 |
| AverageMInFile | 887.0 | 76.714769 | 32.486615 | 6.0 | 56.5 | 75.0 | 93.0 | 219.0 |
| NumSatisfactoryTrades | 887.0 | 20.835400 | 11.204843 | 1.0 | 13.0 | 19.0 | 27.0 | 59.0 |
| NumTrades90Ever2DerogPubRec | 887.0 | 0.400225 | 1.073443 | 0.0 | 0.0 | 0.0 | 0.0 | 16.0 |
| PercentTradesNeverDelq | 887.0 | 92.298760 | 11.973062 | 0.0 | 89.0 | 97.0 | 100.0 | 100.0 |
| MSinceMostRecentDelq | 467.0 | 21.501071 | 20.924386 | 0.0 | 5.0 | 13.0 | 33.0 | 81.0 |
| Num Total Trades | 887.0 | 23.554679 | 12.445416 | 1.0 | 14.5 | 22.0 | 31.0 | 77.0 |
| NumTradesOpeninLast12M | 887.0 | 1.928974 | 1.848227 | 0.0 | 1.0 | 2.0 | 3.0 | 14.0 |
| PercentInstall Trades | 887.0 | 34.572717 | 17.627608 | 0.0 | 22.0 | 33.0 | 44.0 | 100.0 |
| MSinceMostRecentInqexcl7days | 734.0 | 2.282016 | 4.703287 | 0.0 | 0.0 | 0.0 | 2.0 | 23.0 |
| NuminqLast6Mexcl7days | 887.0 | 1.393461 | 2.168855 | 0.0 | 0.0 | 1.0 | 2.0 | 29.0 |
| NetFractionRevolvingBurden | 887.0 | 35.186020 | 28.160663 | 0.0 | 9.0 | 30.0 | 56.0 | 131.0 |
| NetFractionInstallBurden | 887.0 | 66.449831 | 21.108756 | 1.0 | 58.0 | 58.0 | 84.0 | 165.0 |
| NumRevolvingTradesWBalance | 887.0 | 4.122886 | 2.874659 | 0.0 | 2.0 | 4.0 | 5.0 | 18.0 |
| NumInstallTradesWBalance | 887.0 | 2.410372 | 1.518369 | 1.0 | 1.0 | 2.0 | 3.0 | 14.0 |
| NumBank2NatlTradesWHighUtilization | 887.0 | 1.076663 | 1.430397 | 0.0 | 0.0 | 1.0 | 2.0 | 9.0 |
| PercentTradesWBalance | 887.0 | 66.795941 | 21.603707 | 0.0 | 50.0 | 67.0 | 83.0 | 100.0 |

Categorical Features

| | count | unique | top | freq |
|--------------------------|-------|--------|------|------|
| RiskPerformance | 887 | 2 | Bad | 473 |
| MaxDelq2PublicRecLast12M | 887 | 7 | 7 | 382 |
| MaxDelqEver | 887 | 7 | 8 | 409 |
| ConditionNotMet | 887 | 2 | True | 502 |