## Future cash flow analysis

A large global online lending platform that provides loans to both consumers and merchants has hired us to

```
make sure the balance sheet values are correct. We must ensure correct valuation of client portfolio.
          #obtaining dataset
In [38]:
          import pandas as pd
          df = pd.read csv('C:\\Users\\sujoydutta\\Downloads\\Data.csv')
          df.head()
Out[38]:
                        Origination
                 Dates
                                    31.05.2019
                                               30.06.2019 31.07.2019 31.08.2019 30.09.2019 31.10.2019 30.11.2019
                           Amount
          0 31.05.2019 10018746.17 1443069.08
                                               3332200.33 1328138.75
                                                                      928085.74
                                                                                 736418.27
                                                                                             539403.31
                                                                                                        427557.86
          1 30.06.2019 10868379.04
                                         0.00
                                               1392751.60 3011884.91 1237868.70
                                                                                 970929.28
                                                                                             892351.83
                                                                                                        668767.02
          2 31.07.2019 10733932.61
                                         0.00
                                                     0.00 1537650.24 2953335.55 1208316.08
                                                                                             879375.19
                                                                                                        711016.84
          3 31.08.2019 12558727.02
                                          0.00
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                                                                0.00 1617681.94 4082016.00 1387474.94
                                                                                                       1247623.59
             30.09.2019 14505071.44
                                         0.00
                                                     0.00
                                                                0.00
                                                                           0.00 1992242.84 3930445.60
                                                                                                      1394620.78
         5 rows × 22 columns
          # Formula to calculate repayment percentages
In [39]:
          def calculate repayment percentages (df):
               df rep = df.drop(columns=['Dates', 'Origination Amount'])
```

```
origination amount = df['Origination Amount']
repayment percentages = df rep.div(origination amount, axis=0)
return repayment percentages
```

```
In [40]:
        #calculating repayment percentages
        repayment percentages = calculate repayment percentages (df)
        print(repayment percentages.head())
           31.05.2019 30.06.2019 31.07.2019 31.08.2019 30.09.2019 31.10.2019
        0
             0.144037
                      0.332597
                                  0.132565
                                                0.092635
                                                           0.073504
                                                                       0.053839
             0.000000
                        0.128147
                                    0.277124
                                                0.113896
                                                            0.089335
                                                                       0.082105
        2
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                                    0.143251
                                                0.275140
                                                            0.112570
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                                                            0.137348
                                                                       0.270970
           30.11.2019 31.12.2019 31.01.2020 29.02.2020 31.03.2020 30.04.2020
                                  0.023661
                                                         0.011647
        0
             0.042676 0.032385
                                                0.016805
                                                                       0.009253
        1
             0.061533 0.046521
                                    0.038607
                                                0.030295
                                                            0.023483
                                                                       0.018295
        2
             0.066240
                        0.061324
                                                            0.028189
                                                                       0.024097
                                    0.046904
                                                0.039412
        3
             0.099343
                         0.070572
                                    0.055288
                                                0.045468
                                                            0.033222
                                                                       0.026809
             0.096147
                        0.084654
                                    0.064765
                                                0.055351
                                                            0.043325
                                                                       0.040654
           31.05.2020 30.06.2020 31.07.2020 31.08.2020 30.09.2020 31.10.2020
                                               0.002973
                                                          0.002448
        0
             0.006328
                       0.005317
                                   0.003705
                                                                       0.001805
             0.014905
                         0.012740
                                    0.008497
                                                0.007328
                                                            0.005839
                                                                       0.004819
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30.11.2020 31.12.2020
       0
          0.001655 0.001142
       1
          0.003991 0.003442
          0.005721 0.004687
       2
       3
          0.004228 0.003748
       4
          0.009829 0.008056
In [64]: # Function to compute expected repayment percentages
       def compute expected repayment percentages (repayment percentages):
           expected percentages = {}
           for vintage in repayment percentages.index:
              repayments = repayment percentages.loc[vintage]
              p = []
              num months = len(repayments)
              for i in range(num months):
                  if i == 0:
                     p.append(repayments.iloc[0])
                  elif i == 1:
                     if vintage == '31.12.2020':
                         p.append(2 * p[0])
                     else:
                         p.append(repayments.iloc[1])
                  else:
                     previous sum = sum(p[:i])
                     if previous sum < 1:</pre>
                         p = max(repayments.iloc[1] * np.log(1 + (1 - (i) / num months) / (i)
                     else:
                         p_i = max(repayments.iloc[1] * (1 - (i) / num months), 0)
                     p.append(p i)
              expected percentages[vintage] = p
           expected df = pd.DataFrame(expected percentages).T
           expected df.columns = repayment percentages.columns
           expected df = expected df.dropna()
           return expected df
In [65]:
       #calculating expected repayment percentages
       import numpy as np
       expected repayment percentages = compute expected repayment percentages (repayment percen
       print(expected repayment percentages.head())
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           0.144037
       \cap
                    0.332597
                               0.332762 0.564535 0.266077
                                                               0.249447
       1
           0.000000
                      0.128147 0.090877
                                          0.094366 0.098992
                                                               0.105410
       2
          0.000000 0.000000 0.000000 0.000000 0.000000 0.000000
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          0.000000 0.000000 0.000000
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          30.11.2019 31.12.2019 31.01.2020 29.02.2020 31.03.2020 30.04.2020
```

0.010276

0.031527 0.022321 0.019866 0.016537 0.013254 0.011827

0.008363 0.006032

0.008757 0.007184 0.005626

2

3

0.017868 0.015840 0.011885

0.020190 0.015930 0.012092

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3 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000 \quad 0.000000
         31.05.2020 30.06.2020 31.07.2020 31.08.2020 30.09.2020 31.10.2020
         0.051259 0.044851 0.038444 0.032037 0.025629 0.019222
      1
      2
         0.000000 0.000000 0.000000 0.000000 0.000000 0.000000
         30.11.2020 31.12.2020
         0.033260 0.016630
         0.012815 0.006407
      1
         0.000000 0.000000
      2
      3 0.000000 0.000000
         0.000000 0.000000
In [78]: #Function to calculate cash flows
       def calculate forecasted cash flows(df, expected repayment percentages):
          cash flows = {}
          expected repayment percentages.columns = [str(col) for col in expected repayment per
          for index, row in df.iterrows():
             vintage = str(row['Dates'])
             origination amount = row['Origination Amount']
             if vintage in expected repayment percentages.columns:
                expected percentages = expected repayment percentages[vintage]
                forecasted flows = expected percentages.multiply(origination amount)
                cash flows[vintage] = forecasted flows
             else:
                print(f"Warning: {vintage} not found in expected repayment percentages colum
          forecasted df = pd.DataFrame(cash flows).T
          print("Forecasted Cash Flows DataFrame:")
          print(forecasted df.head())
          return forecasted df
       # Recalculate the forecasted cash flows
In [81]:
       forecasted cash flows = calculate forecasted cash flows(df, expected repayment percentag
       forecasted cash flows
      Forecasted Cash Flows DataFrame:
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                        0
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                                                          7
      31.05.2019 1.443069e+06 0.0000000e+00 0.0 0.0 0.0 0.0 0.0 0.0 0.0
      30.06.2019 3.614785e+06 1.392752e+06 0.0 0.0 0.0 0.0 0.0 0.0 0.0
      31.07.2019 3.571847e+06 9.754662e+05 0.0 0.0 0.0 0.0 0.0 0.0 0.0
      31.08.2019 7.089842e+06 1.185119e+06 0.0 0.0 0.0 0.0 0.0 0.0 0.0
      30.09.2019 3.859469e+06 1.435887e+06 0.0 0.0 0.0 0.0 0.0 0.0 0.0
                                                  18
                    10 11 12 13 14 15 16 17
```

0.271782

0.000000 0.000000 0.000000 0.000000 0.000000 0.000000

0.064074

0.057666

0.114918 0.130549 0.161792

1

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           #writing function to calculate discount rate
In [82]:
           def discount cash flows(cash flows, annual rate):
                monthly rate = annual rate / 12 / 100
                discounted cash flows = {}
                for vintage, flows in cash flows.items():
                     discounted flows = [cf / (1 + monthly rate) ** i for i, cf in enumerate(flows, s
                     discounted cash flows[vintage] = discounted flows
                return discounted cash flows
           # Computing present value of the portfolio
In [83]:
           annual discount rate = 2.5
           discounted cash flows = discount cash flows (forecasted cash flows, annual discount rate)
           portfolio value = sum([sum(flows) for flows in discounted cash flows.values()])
           print(f"Calculated Portfolio Value: CHF {portfolio value:.2f}")
           Calculated Portfolio Value: CHF 85076306.30
```

30.06.2019

In [84]:

#comparing with client estimate

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0.0

0.0

0.0

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0.0

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```
client_estimate = 84993122.67

difference = portfolio_value - client_estimate
relative_difference = difference / client_estimate

acceptable = abs(difference) < 500000

print(f"Client's Estimate: CHF {client_estimate:.2f}")
print(f"Difference: CHF {difference:.2f}")
print(f"Relative Difference: {relative_difference:.4%}")
print(f"Difference is acceptable: {acceptable}")</pre>
```

Client's Estimate: CHF 84993122.67

Difference: CHF 83183.63
Relative Difference: 0.0979%
Difference is acceptable: True