Machine Learning User Manual Oracle FLEXCUBE Universal Banking Release 14.4.0.4.0 PART NO - F42209-01 [May] [2021]



FINANCIAL SERVICES



FCUBS Machine Learning [May] [2021] Version 14.4.0.4.0 Oracle Financial Services Software Limited Oracle Park Off Western Express Highway Goregaon (East) Mumbai, Maharashtra 400 063 India Worldwide Inquiries: Phone: +91 22 6718 3000 Fax: +91 22 6718 3001

https://www.oracle.com/industries/financial-services/index.html

Copyright © [2007, 2021], Oracle and/or its affiliates. All rights reserved.

Oracle and Java are registered trademarks of Oracle and/or its affiliates. Other names may be trademarks of their respective owners.

U.S. GOVERNMENT END USERS: Oracle programs, including any operating system, integrated software, any programs installed on the hardware, and/or documentation, delivered to U.S. Government end users are "commercial computer software" pursuant to the applicable Federal Acquisition Regulation and agency-specific supplemental regulations. As such, use, duplication, disclosure, modification, and adaptation of the programs, including any operating system, integrated software, any programs installed on the hardware, and/or documentation, shall be subject to license terms and license restrictions applicable to the programs. No other rights are granted to the U.S. Government.

This software or hardware is developed for general use in a variety of information management applications. It is not developed or intended for use in any inherently dangerous applications, including applications that may create a risk of personal injury. If you use this software or hardware in dangerous applications, then you shall be responsible to take all appropriate failsafe, backup, redundancy, and other measures to ensure its safe use. Oracle Corporation and its affiliates disclaim any liability for any damages caused by use of this software or hardware in dangerous applications.

This software and related documentation are provided under a license agreement containing restrictions on use and disclosure and are protected by intellectual property laws. Except as expressly permitted in your license agreement or allowed by law, you may not use, copy, reproduce, translate, broadcast, modify, license, transmit, distribute, exhibit, perform, publish or display any part, in any form, or by any means. Reverse engineering, disassembly, or decompilation of this software, unless required by law for interoperability, is prohibited. The information contained herein is subject to change without notice and is not warranted to be error-free. If you find any errors, please report them to us in writing.

This software or hardware and documentation may provide access to or information on content, products and services from third parties. Oracle Corporation and its affiliates are not responsible for and expressly disclaim all warranties of any kind with respect to third-party content, products, and services. Oracle Corporation and its affiliates will not be responsible for any loss, costs, or damages incurred due to your access to or use of third-party content, products, products, or services.



Table of Contents

1	Pre	face4
	1.1	Introduction:4
	1.2	Audience:4
	1.3	Organization:4
2	Ove	erview of Machine Learning5
	2.1	An Introduction:5
	2.2	Machine Learning in Oracle FLEXCUBE5
	2.3	Pre-requisites5
3	Мо	del Building Routine:7
	3.1	Contextual Information7
	3.2	Model building7
4	Мо	del Execution Routine8
	4.1	Contextual Information8
	4.2	Model Execution9
5	Ent	erprise Dashboard10
	5.1	Enterprise Customer Attrition10
	5.2	Enterprise Customer Segmentation10
6	Bra	nch Dashboard11
	6.1	Branch customer Attrition11
	6.2	Branch customer segmentation11
7	Cus	tomer Query Board12



1 Preface

1.1 Introduction:

This manual is designed to assist you in getting acquainted with the Oracle FLEXCUBE Machine Learning framework.

It has detailed stepwise instructions to help you build Oracle FLEXCUBE Machine Learning models and process their execution.

The manual also outlines how to access and interpret the model outcomes for augmented decision making.

1.2 Audience:

This manual is intended for the following Users/ User Roles:

Role	Function
Branch Managers	Overall Branch Perspective
Account Managers/ Relationship Managers	Customer Relationship Management
Head Office Managers	Overall Bank Perspective
FLEXCUBE Admin / IT support	Application Administration and Support

1.3 Organization:

This manual is organized as per the following chapters

Chapter	Description
Overview of Machine Learning	It introduces the Machine Learning context and specifically the Oracle FLEXCUBE framework
Model Building Routine	This chapter contains instructions on how to build Machine Learning Models using historical Oracle FLEXCUBE data
Model Execution Routine	This chapter explains how to apply Machine Learning Models on Oracle FLEXCUBE data
Enterprise Dashboard	This section helps you interpret information collated across the enterprise and present a consolidated perspective of the bank
Branch Dashboard	This screen helps you interpret information from the current branch perspective
Customer Query Board	This allows you to query customers across the bank based on attrition Risk profile, branch code and/or segment.



2 Overview of Machine Learning

2.1 An Introduction:

Machine Learning is heavily dependent on historical data to build models and use the models to predict outcomes for better decision making

The following points encompasses contextual information to help you get familiarized with the subject

- 1. Machine learning model building is dependent on historical data, spread across dates
- 2. Model building will take time. It may range from couple of minutes to hours, sometime days, depending on the algorithm complexity
- 3. Model has to be built for each bank. It cannot be pre-shipped not it can be re-used across banks.
- 4. Model is ONLY as good as the data used to build it
- 5. Built Model are valid only for the data used to build the model
- 6. The pre-shipped ORE code is designed to work with the data model provided as part of the release
- 7. The modelling code may need to be modified under the following circumstances
 - a. The underlying data limits model performance and mandates modifying the preshipped ORE code
 - b. Data Model is altered, on business demand

2.2 Machine Learning in Oracle FLEXCUBE

The machine learning framework is embedded within Oracle FLEXCUBE. It is built using Oracle R Enterprise, which is separately licensed.

The business cases are limited to retail customers.

2.3 Pre-requisites

The following Pre-requisites are mandatory for the Machine Learning Framework

Environmental

1. Separate instance of Machine Learning Server.



Note: ORE database MUST be a separate instance from Oracle FLEXCUBE Instance. This is to ensure that the machine learning algorithmic processing workload is not on the critical path of banking operations and consume critical FLEXCUBE server memory

- 2. Machine Learning Database is Oracle 18c
- 3. Oracle R Enterprise is installed in the Machine Learning Server

Historical Data





Date wise transaction history in Oracle FLEXCUBE is <u>mandatorily</u> required for building machine learning models. Consulting/Solution team to consider extracting legacy transaction history as part of migration strategy

Oracle FLEXCUBE Data Replication



Data replication from FLEXCUBE to the Machine learning server is outside the purview of this manual.

Any data replication software could be deployed to replicate Oracle FLEXCUBE data to the Machine Learning database Instance

It is left to the bank/solution team to decide on the data Replication Software including the mode of replication and frequency of replication

Please refer to the <u>Installation Guide</u> for completing the installation, prior to initiating the model building routine



3 Model Building Routine:

Please refer to the Pre-requisites prior to proceeding with the next section.

This is the first step to be executed.

3.1 Contextual Information

This is the first time the Machine Learning is being setup for Oracle FLEXCUBE.

As part of this process, historical FLEXCUBE data will be referenced and requisite data transformation routine will be called. Customer churn model is the only one that will be built. The customer life time value and segmentation do not have a persistent model object and gets executed runtime.

3.2 Model building

User(s)

It is suggested that only the FLEXCUBE user with admin rights should have access to the model building screens

Launch "Model Execution and Control" screen from the menu

Machine Learning Retail -> Model Administration -> Model Execution and Control

Model Execution and Control					- :
Period Start Date	2011-12-31 🔠	Period End Date	2012-12-31 🖽		
Attrition Date	2013-03-31 🔝	Silent Period To Consider For Attrition(Days)	180		
	Model Build				
Build Suggestions	0	Model E	Building Status:		
Start date should be 27 months prior to application date			Last Run		
Churn date should at the least be 3 n	The span between period start and end should at the least be 12 month Churn date should at the least be 3 months after period end date		Historical Data Refresh		
Span of period should be in multiple of 4 months			Model Build		
Execute Suggestions		Model E	xecution Status:		
The span between period start and er	nd should at the least be 12	months	Last Run		
			Current Data Refresh	Current Data Refresh	
			Model Execution	Completed	
Model building/execution routine ma	ay extend from several minute to hou	25 15			Exit

Select "Model Build" radio button

DATA FIELDS	REMARKS
Period Start Date	Models get built on historical data. This is the
	historical period start date to be considered
Period End Date	Models get built on historical data. This is the
	historical period end date to be considered



Churn Date	This field represents the future prediction window.			
	E.g. if we want to have a prediction window of 3			
	months, this would be Period End Date + 3 months			
Silent Period to consider for churn	While closed customers are considered as churned,			
identification	for open customers having sufficiently long silent			
	period of no transaction can also be considered as			
	churned. This is the field that determines the number			
	of silent days, to be considered for open customers to			
	be tagged as churned.			

Suggestions:

- PERIOD START DATE and PERIOD END DATE to cover a span of 12 Months back period
- CHURN DATE to be at least 3 months into the future from the PERIOD END DATE

Process "Model Build" routine

Click "process" button to trigger model building

Please note

- Model building time may extend from several minutes to few hours
- Models once built can be re-used each time the data is refreshed
- Models are usually re-built, if the underlying data has undergone drastic change in pattern and triggers a decrease in model performance

4 Model Execution Routine

Please refer to the pre-requisites prior to proceeding with the next section.

This is the second step to be executed. It is assumed that model building routine mentioned in the previous section is already processed.

4.1 Contextual Information

As part of this process, data will be refreshed as of the current date. The customer churn model that has been built in the previous step will be loaded and executed. As part of this routine the customer life time value and segmentation models will get built and executed runtime.



4.2 Model Execution

User(s)

It is suggested that only the FLEXCUBE user with admin rights should have access to the model execution screens

Launch "Model Execution and Control" screen from the menu

Machine Learning Retail -> Model Administration -> Model Execution and Control

Model Execution and Control					_
Period Start Date	2018-01-14 📰	Period End Date 2019-01-	1-14		
Attrition Date	2019-01-14	Silent Period To Consider For Attrition(Days)			
	O Model Build				
Build Suggestions	Model Execute	Model Building S	Status:		
Start date should be 27 months prior	to application date	10th	Last Run		
Churn date should at the least be 3 m	nd should at the least be months after period end d	te Historica	cal Data Refresh		
Span of period should be in multiple of	of 4 months		Model Build		
Execute Suggestions		Model Execution	on Status:		
The span between period start and en	nd should at the least be	12 months	Last Run		
		Currer	ent Data Refresh	Current Data Refresh	
		м	Model Execution	Completed	
Model building/execution routine ma	ay extend from several mi	nutes			Exit

Select "Model Execute" radio button

DATA FIELDS	REMARKS
Period Start Date	Will get defaulted to 12 months prior to Period End
	date. User can modify.
Period End Date	Will get defaulted to maximum of today from
	sttm_dates. Not allowed to modify
Churn Date	Will get defaulted to Period End date. Not allowed to
	modify
Silent Period to consider for churn	Will get defaulted to 180 days. Not allowed to modify
identification	

Suggestions:

- PERIOD START DATE and PERIOD END DATE to cover a span of 12 Months



Process "Model Execute" routine

Click "process" button to trigger model execution

Periodic Model Execution

- Model execution frequency will be decided by business

Please note

- Model execution time may extend from several minutes to few hours
- Built Models are re-used each time the data is refreshed

5 Enterprise Dashboard

This screen displays model outcomes collated across the enterprise to present a consolidated perspective of the bank

Only customers with at least one transaction are being displayed

The screen can be accessed at

Machine Learning Retail -> Customer -> Enterprise Dashboard

5.1 Enterprise Customer Attrition

This screen displays the risk profile of the entire customer base of the bank

Enterprise Dashboard										
Attrition Risk Segmentatio	in									
Predicted Customer Attrit	tion Risk									
🕷 < 1 Of 1 🕨 🗵	Go		M	< 1 Of 1 🕨 🗎	Go		M	< 1 Of 1 🕨 🗎	Go	
Category of Risk	Percent (%)*	Number of Customers	~	Top 5 Branches	Percent (%)*	Number of Customers	\checkmark	Bottom 5 Branches	Percent (%)*	Number of Customers
			/			v				×
HIGH	033.54	26481	\checkmark	291	051.33	367	\checkmark	000	002.50	44
MEDIUM	003.84	3032	~	033	049.38	319	\checkmark	272	020.23	89
LOW	001.95	1541	~	035	047.04	183	~	176	020.46	106
TRANSITION	000.43	338	~	013	046.12	529	\checkmark	261	023.48	135
NO RISK	060.24	47568	~	252	045.83	297	~	223	023.87	323
	Attrition Analysis									

- Top 5 and bottom 5 branches can be queried on the basis of attrition risk profile.
- Default query is HIGH Risk
- Select single or a combination of Risk categories and click on the button "Churn Analysis" to get the top 5 and bottom 5 for the queried combination of risk categories

5.2 Enterprise Customer Segmentation

This screen displays the segmentation of the entire customer base of the bank and the segment Details.

This is a view only screen.



Enterprise Dashboard							-
Attrition Risk Segmentation	n						
Segmentation Distribution	and Profile Details						
🛤 < 1 Of 1 🕨 🗎	Go						
Customer Segment	Percent (%)*	Number of Customers	Customer Age (In Years)	Relationship Period (In Days)	Silent Period (In Days)	Life Time Value	<u> </u>
✓ 1	000.00	1	49 To 49	75 To 75	20 To 20	0 To 0	Â
✓ 2	000.00	1	40 To 40	132 To 132	90 To 90	0 To 0	
✓ 3	000.00	1	42 To 42	1133 To 1133	37 To 37	0 To 0	
✓ 4	000.00	1	40 To 40	82 To 82	93 To 93	0 To 0	
✓ 5	000.01	4	33 To 65	-190 To 934	28 To 192	0 To 0	
✓ 6	000.23	178	21 To 70	-102 To 1371	17 To 360	0 To 1388.34	~
<							>

6 Branch Dashboard

This screen displays model outcome for the current logged-in branch

Only customers with at least one transaction are being displayed

The screen can be accessed at

Machine Learning Retail -> Customer -> Branch Dashboard

6.1 Branch customer Attrition

This screen displays the customer attrition risk profile of the current branch.

It is a view only screen.

Branch Dashboard									
Attrition Risk Segmentation									
Predicted Customer Attrition Risk									
K < 1 Of 1 ► × Go			=						
Category of Risk	Percent (%)*	Number of Customers	<u>^</u>						
			×						
V HIGH	047.06	8							
V MEDIUM	017.65	3							
V TRANSITION	029.41	5							
V NO RISK	005.88	1							
<			>						

6.2 Branch customer segmentation

This screen displays the segmentation of the customer base of the current branch and the segment details.

This is a view only screen.



aranch Dashboard										
Attrition Risk Segmentation Segment Distribution and Profi	le Details									
K < 1 Of 1 ► N										
Customer Segment	Percent (%)*	Number of Customers	Customer Age (In Years)	Relationship Period (In Days)	Silent Period (In Days)	Life Time Value	<u></u>			
✓ 1	100.00	17	23 To 36	0013 To 623	0 To 174	56.89 To 17193.66	v			

7 Customer Query Board

This screen can be assessed at

Machine Learning Retail -> Customer -> Customer Query Board

It allows user to query customers based on the following filters

- Attrition Risk profile
- Branch code
- Customer Segment

However, Individual customer IDs can also be queried. In that case, it will display the customer's corresponding risk and segment

Select the query combination and click on "Analysis"

The default query at screen launch is,

Attrition Risk profile	: HIGH
Branch code	: current logged-in branch
Customer Segment	: 1

The displayed information for each customer has been collated across,

- Risk Profiles
- Segment to which the customer belongs
- Life time Value, should the customer continue the relationship till perpetuity
- Recommended product(s) for the customer, with decreasing order of recommendation, based on the historical purchase behavior of the segment to which the customer belongs

Further, to assist in decision making and identify relative positioning, comparative life time value information is presented across the perspectives of,

Segment Life Time Value

- Segment Minimum
- Segment Median
- Segment Maximum

Bank Life Time Value

- Segment Minimum



- Segment Median
- Segment Maximum

Custom	er Id		Q					Branch	Code (000	۵				
1 Of 1 🕨 🕷	Go							+	- :::	🖂 🕇 1 Of 1 🕨	Go			+ -	-
Category o	of Risk	Perc	ent (%)*		Number of Cu	ustomers			0	Cust	omer Segment				
HIGH	0	063.85		0	47127		0			1	0				
MEDIUM	P	025.87		0	19094		0			2	0				
LOW	P	006.91		P	5097		P			3	P				
TRANSITION	P	001.24		P	915		P								
NO RISK	P	002.14		P	1581		D								
	Analyze														
1 Of 58 🕨 🕅	Analyze													+ -	
1 Of 58 > X Customer Id	Analyze Go Na	ame		Branch Co	ode Category	of Risk	Customer Segn	ent Life Time	Value	Product R	acommendations	Segm	ent Min	Segr	mer
1 Of 58 Customer Id 000000205	Analyze Go Na CUSTOMER_0	ame 00000205	0 0	Branch Co	Dde Category	of Risk	Customer Segn	ent Life Time	Value	Product R 023,022,025	∋commendations	Segm	ent Min	Segr 0	mei
1 Of 58 > Customer Id	Analyze Go Na CUSTOMER_0 CUSTOMER_0	ame 00000205 00000706		Branch Co 000 000	Ode Category MEDIUM COW	of Risk	Customer Segn 2 2	ent Life Time 2 1228.03 2 58.06	Value	Product Re 023,022,025 021,023,0105	acommendations Γ Γ	Segm	ent Min	Segr 0 0	me
1 Of 58 > > Customer Id 000000205 0 000000706 0 000000148 0	Analyze Go Na CUSTOMER_0 CUSTOMER_0 CUSTOMER_0	ame 00000205 00000706 00000148		Branch Co 000 000	ode Category MEDIUM LOW LOW	of Risk	Customer Segm 2 2 2	ent Life Time 1228.03 58.06 0	e Value	Product R 023,022,025 021,023,0105 021,0105,025	acommendations C C C	Segm 0 0 0 0 0	ent Min	Segr 0 0 0	mei
1 Of 58 > > Customer Id 000000205 0 000000706 0 000000148 0 000000028 0	Analyze Go Na CUSTOMER_0 CUSTOMER_0 CUSTOMER_0 CUSTOMER_0	ame 00000205 00000706 00000148 00000028		Branch Co 000 000 000	Category MEDIUM LOW LOW LOW	of Risk	Customer Segn 2 2 2 2 2	Life Time 1228.03 58.06 0 0 0 0	Value	Product Ro 023,022,025 021,023,0105 021,0105,025 021,0107,023	acommendations C C C C C	Segm 0 0 0 0 0 0 0 0 0	ent Min D D D D	Segr 0 0 0 0	mer
1 Of 58 Customer Id Councer Id C	Analyze Go CUSTOMER_0 CUSTOMER_0 CUSTOMER_0 CUSTOMER_0 CUSTOMER_0	ame 00000205 00000706 00000148 00000028 00000051		Branch Co 000 000 000 000 000	Category MEDIUM LOW LOW LOW LOW MEDIUM	of Risk	Customer Segn 2 2 2 2 2 2 2	Life Time 1228.03 58.06 0 0 0 0 0 0 0 0 0 0	Value	Product Ro 023,022,025 021,023,0105 021,0105,025 021,0107,023 021,0105,022	acommendations C C C C C C C C C C C C C C C C C C C	Segm 0 0 0 0 0 0 0 0 0 0 0 0 0 0	ent Min D D D D D D D	Segr 0 0 0 0 0	mer
1 0f 58 ► M Customer Id 000000205 Ω 000000706 Ω 000000148 Ω 00000028 Ω 000000011 Ω	Analyze Go Na CUSTOMER_0 CUSTOMER_0 CUSTOMER_0 CUSTOMER_0 CUSTOMER_0 CUSTOMER_0	ame 00000205 00000706 00000148 0000028 00000051 000001114		Branch Co 000 000 000 000 000 000	Ade Category MEDIUM LOW LOW LOW MEDIUM DUW	of Risk	Customer Segn 2 2 2 2 2 2 2 2 2	Life Time 1228.03 58.06 0 0 0 0 0 0 0 0 0 0 0 0	Value	Product R0 023,022,025 021,023,0105 021,0105,025 021,0105,022 0105,022,025	acommendations C C C C C C C C C C C C C C C C C C C	Segm 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	ent Min P P P P P P P P P P P P	Segr 0 0 0 0 0 0 0	me

