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### Credit Card\_EDA

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Import Datasets

```
[1] system("gdown --id 1BxoFiJZD6vIUYz7u5yh8d_4w0pq7FZH7")
df1 = read.csv("credit_record.csv")

[2] system("gdown --id 1_ro1s6haYmH0gMSM4rTWfQkg6fDH2Wfb")
df2 = read.csv("application_record.csv")

[3] head(df1)
```

A data.frame: 6 x 3

	ID	MONTHS_BALANCE	STATUS
	<int>	<int>	<chr>
1	5001711	0	X
2	5001711	-1	0
3	5001711	-2	0
4	5001711	-3	0
5	5001712	0	C
6	5001712	-1	C

```
head(df2)
```

Double-click (or enter) to edit

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```
[3] 2 5001711 -1 0
3 5001711 -2 0
4 5001711 -3 0
5 5001712 0 C
6 5001712 -1 C
```

```
[4] head(df2)
```

A data.frame: 6 x 18

	ID	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_EDUCATION_TYPE	NAME_FAMILY_STATUS	NAME_HOUSING
	<int>	<chr>	<chr>	<chr>	<int>	<dbl>	<chr>	<chr>	<chr>	
1	5008804	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apa
2	5008805	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apa
3	5008806	M	Y	Y	0	112500	Working	Secondary / secondary special	Married	House / apa
4	5008808	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
5	5008809	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
6	5008810	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa

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Handling missing values and duplicates

Check for the missing values. Find a column-wise count of missing values

```
[6] sum(is.na(df1))
```

```
0
```

```
[7] colSums(is.na(df1))
```

```
ID:      0 MONTHS_BALANCE:  0 STATUS:      0
```

```
head(df2)
```

A data.frame: 6 x 18

	ID	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_EDUCATION_TYPE	NAME_FAMILY_STATUS	NAME_HOUSING
	<int>	<chr>	<chr>	<chr>	<int>	<dbl>	<chr>	<chr>	<chr>	<chr>
1	5008804	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apt
2	5008805	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apt
3	5008806	M	Y	Y	0	112500	Working	Secondary / secondary special	Married	House / apt
4	5008808	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt
5	5008809	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt
6	5008810	F	N	Y	0	270000	Commercial	Secondary / secondary	Single / not married	House / apt

[illegible]

```
colSums(is.na(df2))
```

ID:	0	CODE_GENDER:	0	FLAG_OWN_CAR:	0	FLAG_OWN_REALTY:	0	CNT_CHILDREN:	0	AMT_INCOME_TOTAL:	0	NAME_INCOME_TYPE:	0
NAME_EDUCATION_TYPE:	0	NAME_FAMILY_STATUS:	0	NAME_HOUSING_TYPE:	0	DAYS_BIRTH:	0	DAYS_EMPLOYED:	0	FLAG_MOBIL:	0	FLAG_WORK_PHONE:	0
FLAG_PHONE:	0	FLAG_EMAIL:	0	OCCUPATION_TYPE:	0	CNT_FAM_MEMBERS:	0						

[illegible]

```
111) colSums(is.na(df2))
```

ID:	0	CODE_GENDER:	0	FLAG_OWN_CAR:	0	FLAG_OWN_REALTY:	0	CNT_CHILDREN:	0	AMT_INCOME_TOTAL:	0	NAME_INCOME_TYPE:	0
NAME_EDUCATION_TYPE:	0	NAME_FAMILY_STATUS:	0	NAME_HOUSING_TYPE:	0	DAYS_BIRTH:	0	DAYS_EMPLOYED:	0	FLAG_MOBIL:	0	FLAG_WORK_PHONE:	0
0	FLAG_PHONE:	0	FLAG_EMAIL:	0	OCCUPATION_TYPE:	0	CNT_FAM_MEMBERS:	0					

```
#Remove missing values from dataframe
na.omit(df1)
  id      date      time      A
1  1048546  5150487      0      C
2  1048547  5150487     -1      C
3  1048548  5150487     -2      C
4  1048549  5150487     -3      C
5  1048550  5150487     -4      C
6  1048551  5150487     -5      C
7  1048552  5150487     -6      C
8  1048553  5150487     -7      C
9  1048554  5150487     -8      C
10 1048555  5150487     -9      C
11 1048556  5150487    -10      C
```

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na.omit(df2)

438529	6836901	F	N	Y	0	315000	Pensioner	Secondary / secondary special	Separated	House
438530	6836902	F	N	Y	0	315000	Pensioner	Secondary / secondary special	Separated	House
438531	6836990	M	N	N	0	360000	Commercial associate	Higher education	Separated	House
438532	6836991	F	N	N	0	360000	Commercial associate	Higher education	Separated	House
438533	6836995	F	N	N	0	360000	Commercial associate	Higher education	Separated	House
438534	6837198	F	N	N	0	211500	Pensioner	Higher education	Separated	House
438535	6837235	F	N	Y	0	135000	Working	Secondary / secondary special	Married	House
438536	6837236	F	N	Y	0	135000	Working	Secondary / secondary special	Married	House
438537	6837264	F	N	N	2	90000	State servant	Higher education	Single / not married	House
438538	6837450	M	N	Y	1	135000	Working	Secondary / secondary special	Separated	House
438539	6837452	M	N	N	1	135000	Working	Secondary / secondary special	Separated	House
438540	6837454	M	Y	Y	1	162000	State servant	Secondary / secondary special	Married	House
438541	6837493	M	N	Y	0	180000	Pensioner	Secondary / secondary special	Married	House
438542	6837707	M	N	Y	0	202500	Working	Higher education	Civil marriage	House

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```
[ ] na.omit(df2)
```

438555	6841878	F	N	N	0	54000	Commercial associate	Higher education	Single / not married	
438556	6842765	F	N	Y	0	72000	Pensioner	Secondary / secondary special	Married	House
438557	6842885	F	N	Y	0	121500	Working	Secondary / secondary special	Married	House

```
[ ] #Store data after removing Missing values back in df2
df2 <- na.omit(df2)
```

```
[ ] duplicated_ids <- df2$ID[duplicated(df2$ID)]
print(duplicated_ids)
```

```
[1] 7602432 7052783 7838075 7053557 7023651 7213374 7089090 7576316 7023108
[10] 7137299 7836711 7022197 7636389 7207977 7045794 7154819 7836971 7416167
[19] 7702238 7155150 7317997 7036518 7772847 7243768 7743418 7090931 7603224
[28] 7833087 7742298 7050948 7174719 7744386 7052812 7022327 7154598 7046068
[37] 7045885 7636756 7702516 7099881 7372589 7024111 7282535 7742853 7135270
[46] 7091721 7618285
```

```
duplicated_ids <- df2$ID[duplicated(df2$ID)]
print(duplicated_ids)
```

```
[1] 7602432 7052783 7838075 7053557 7023651 7213374 7089090 7576316 7023108
[10] 7137299 7836711 7022197 7636389 7207977 7045794 7154819 7836971 7416167
[19] 7702238 7155150 7317997 7036518 7772847 7243768 7743418 7090931 7603224
[28] 7833087 7742298 7050948 7174719 7744386 7052812 7022327 7154598 7046068
[37] 7045885 7636756 7702516 7099881 7372589 7024111 7282535 7742853 7135270
[46] 7091721 7618285
```

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```

duplicated_ids <- df2$ID[duplicated(df2$ID)]
print(duplicated_ids)

[1] 7602432 7052783 7838075 7053557 7023651 7213374 7089090 7576316 7023108
[10] 7137299 7836711 7022107 7636389 7207977 7045794 7154819 7836971 7416167
[19] 7702238 7155150 7317997 7036518 7772847 7243768 7743418 7080931 7603224
[28] 7833007 7742298 7050948 7174719 7744386 7052012 7022327 7154500 7046060
[37] 7045885 7636756 7702516 7099881 7372589 7024111 7282535 7742853 7135270
[46] 7091721 7618285

```

Check for duplicates in the 'ID' column and remove any

```

[17] df1 <- df1[!duplicated(df1$ID), ]

[18] # Remove duplicates from the dataframe
df2 <- df2[!duplicated(df2$ID), ]

```

Feature analysis:

What percentage of IDs are common between the two tables?

```

[19] # Identify common IDs
length(intersect(df1$ID, df2$ID))

36457

[20] length(unique(c(df1$ID, df2$ID)))

448038

```

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Visualize the distribution of income types

```

[22] head(df2)

```

A data.frame: 6 x 10

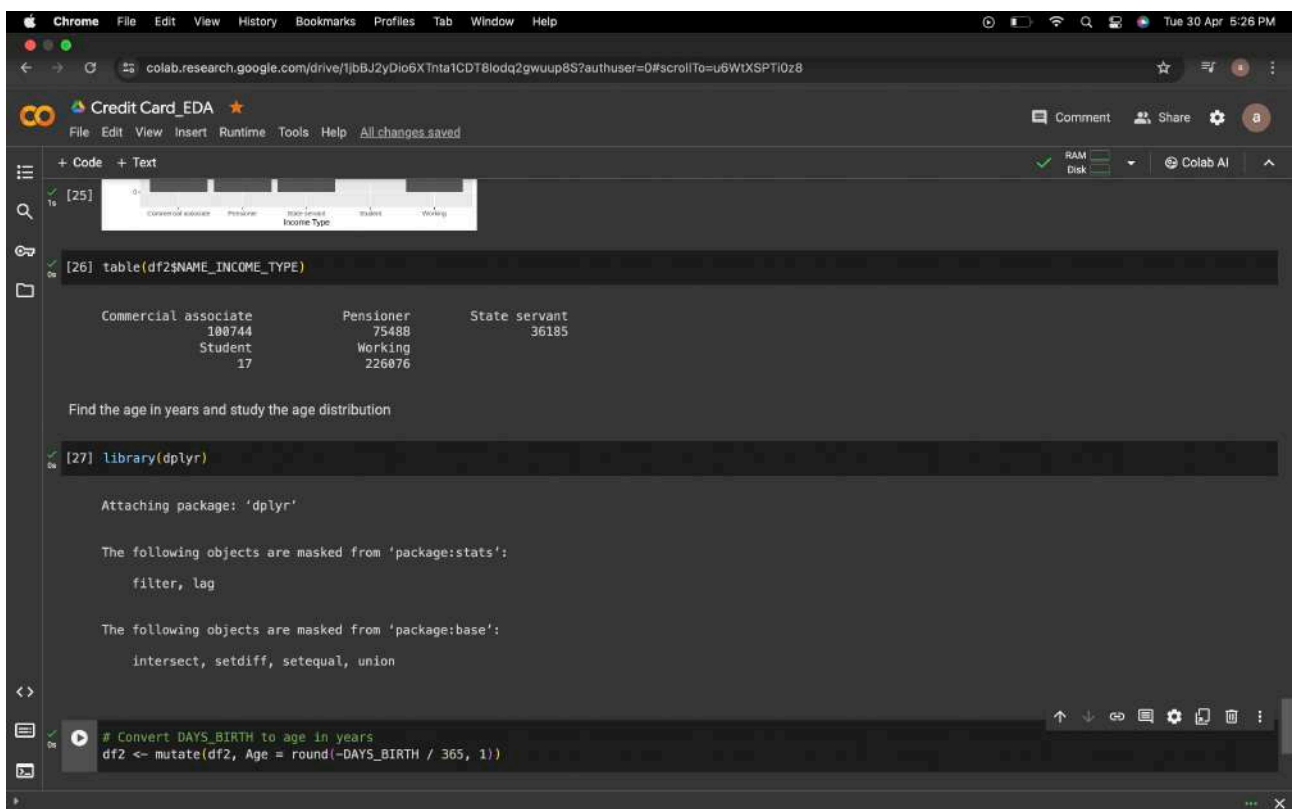
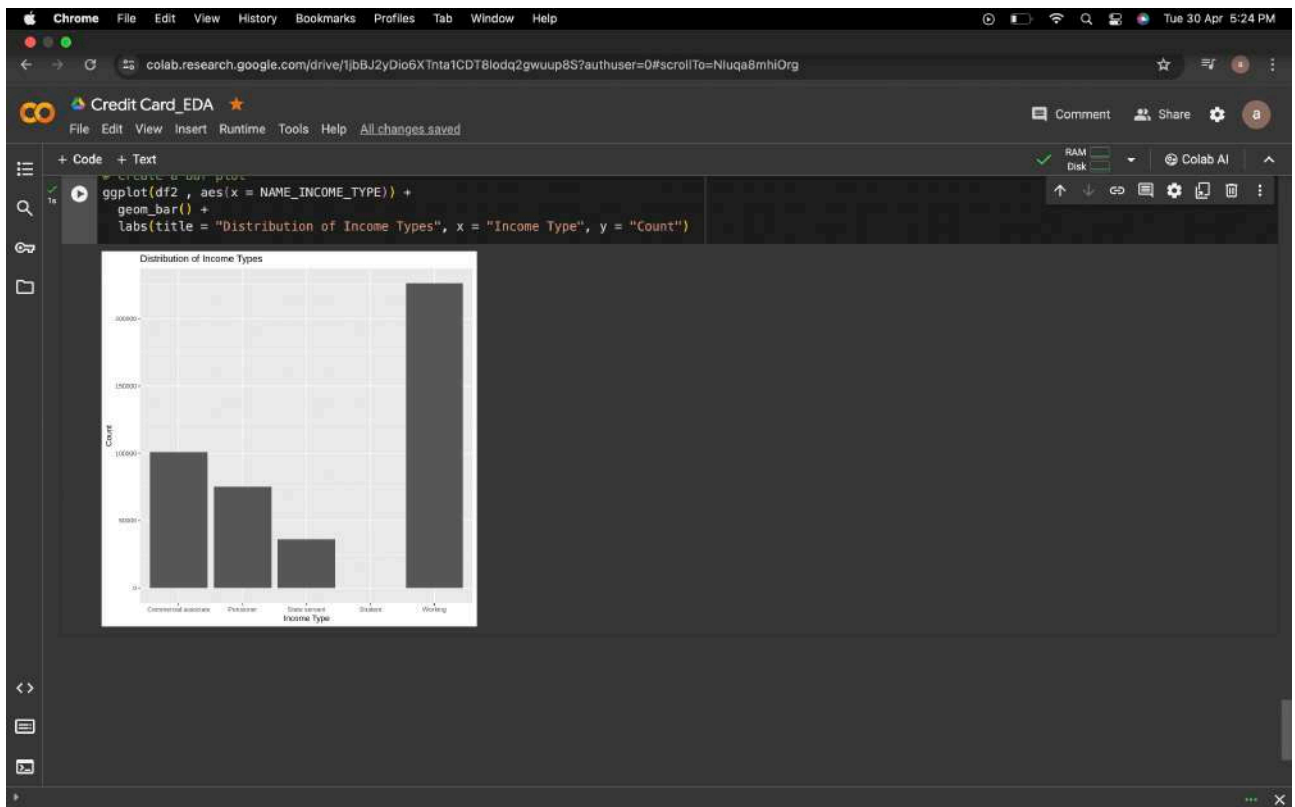
	ID	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_EDUCATION_TYPE	NAME_FAMILY_STATUS	NAME_HOUSING
	<int>	<chr>	<chr>	<chr>	<int>	<dbl>	<chr>	<chr>	<chr>	<chr>
1	5008804	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apa
2	5008805	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apa
3	5008806	M	Y	Y	0	112500	Working	Secondary / secondary special	Married	House / apa
4	5008808	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
5	5008809	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
6	5008810	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa

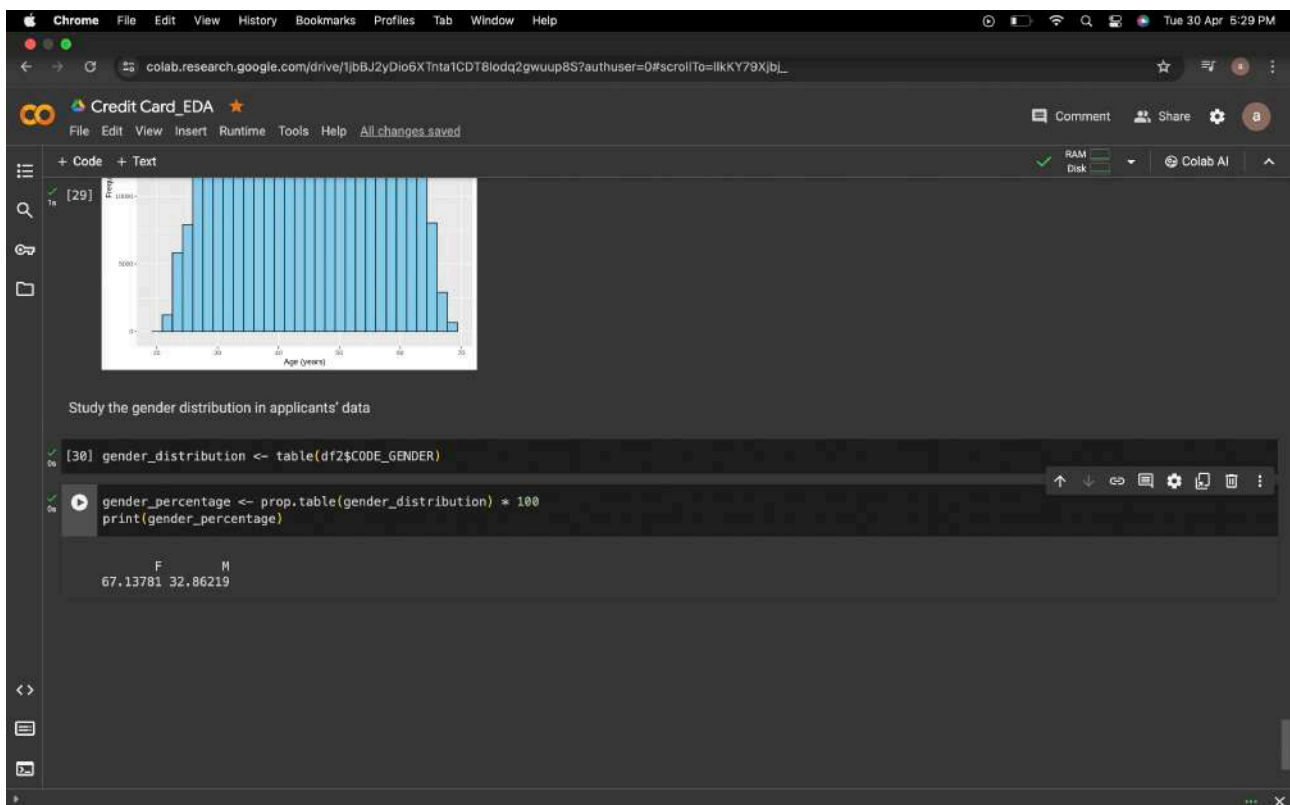
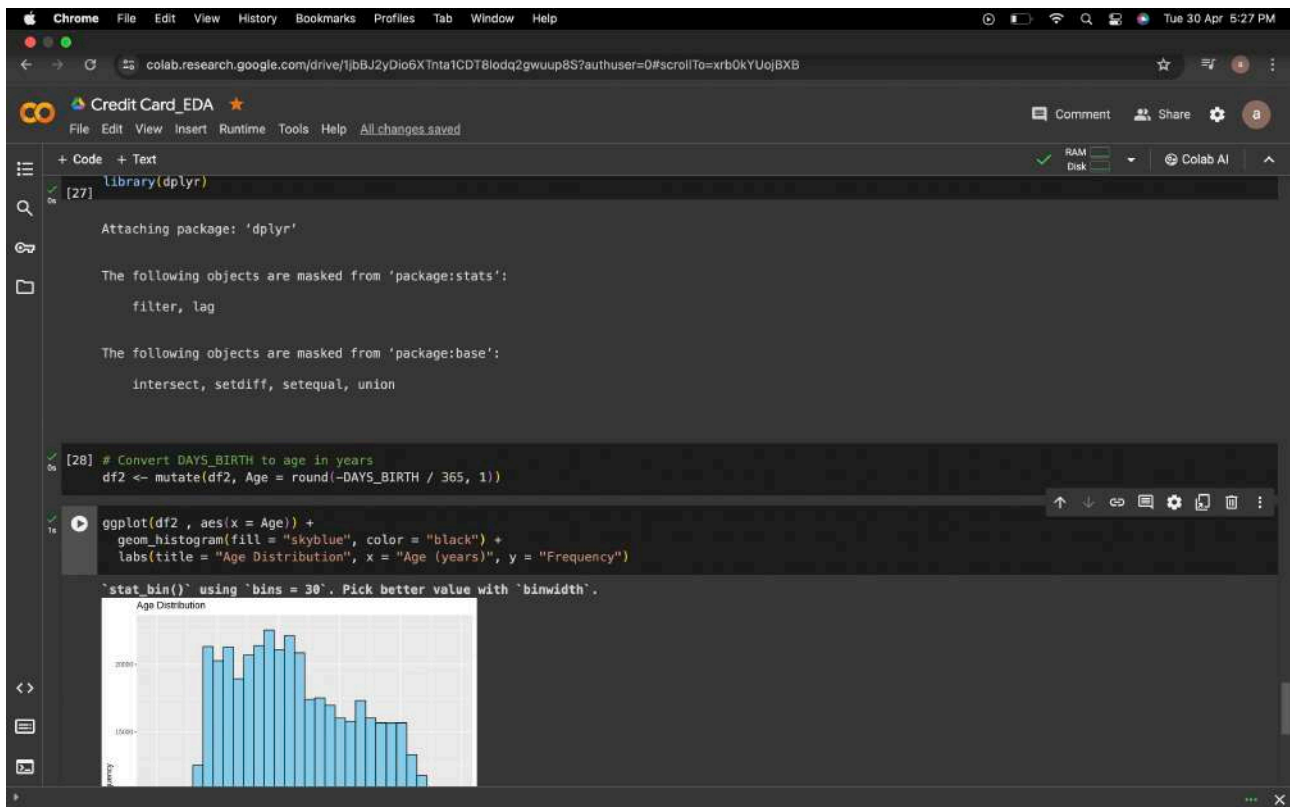
```

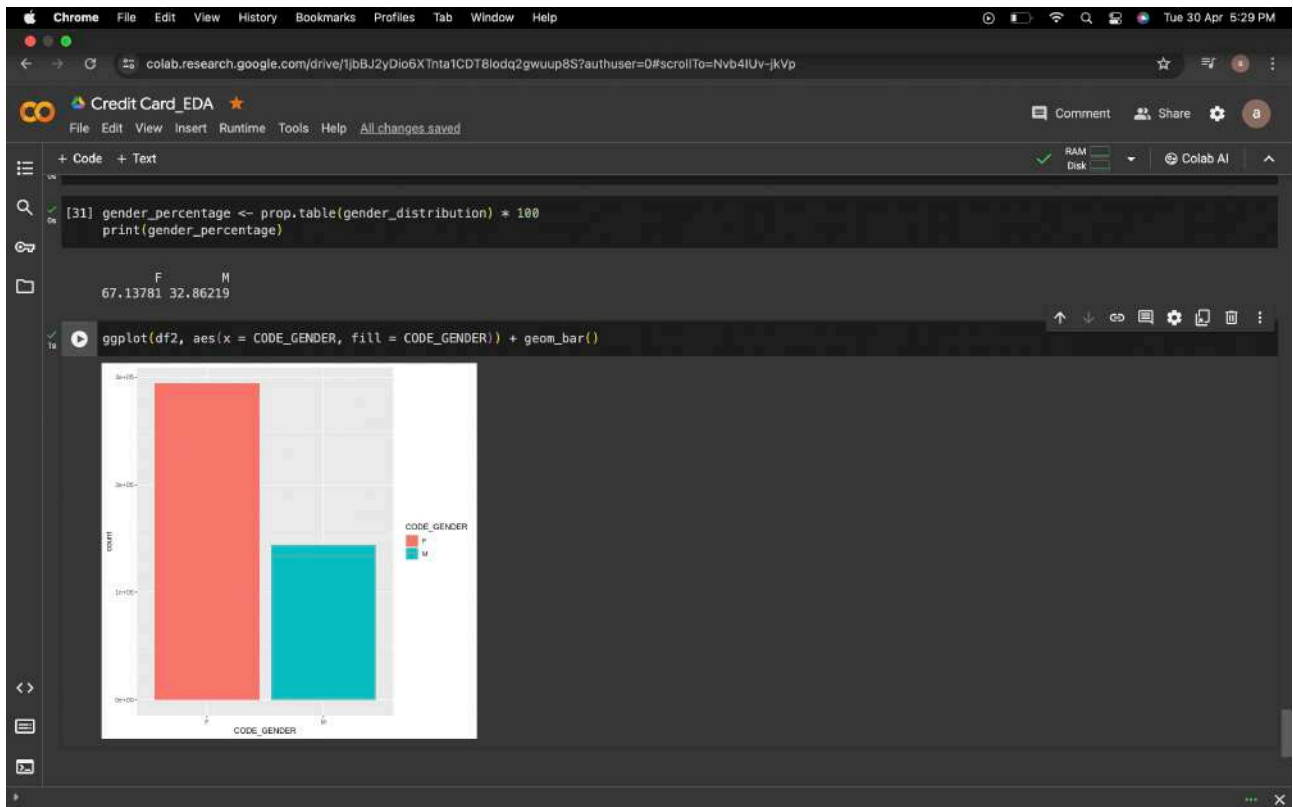
[ ] library(ggplot2)

#Visualize the distribution of income types
# Create a bar plot
ggplot(df2, aes(x = NAME_INCOME_TYPE)) +
  geom_bar() +
  labs(title = "Distribution of Income Types", x = "Income Type", y = "Count")

```







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```
[32]
```

CODE\_GENDER

Study the average annual income across different education levels

```
head(df2)
```

A data frame: 6 x 19

	ID	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_EDUCATION_TYPE	NAME_FAMILY_STATUS	NAME_HOUSING
	<int>	<chr>	<chr>	<chr>	<int>	<dbl>	<chr>	<chr>	<chr>	<chr>
1	5008804	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apa
2	5008805	M	Y	Y	0	427500	Working	Higher education	Civil marriage	Rented apa
3	5008806	M	Y	Y	0	112500	Working	Secondary / secondary special	Married	House / apa
4	5008808	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
5	5008809	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
6	5008810	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa



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3	5008808	M	Y	Y	0	112500	Working	Secondary / secondary special	Married	House / apa
4	5008808	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
5	5008809	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa
6	5008810	F	N	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apa

```
[33] average_income <- df2 %>%
  group_by(NAME_EDUCATION_TYPE) %>%
  summarise(avg_income = mean(AMT_INCOME_TOTAL))

print(average_income)
```

```
# A tibble: 5 × 2
  NAME_EDUCATION_TYPE avg_income
<chr>                <dbl>
1 Academic degree     240692.
2 Higher education    226110.
3 Incomplete higher    207330.
4 Lower secondary     143934.
5 Secondary / secondary special 172057.
```

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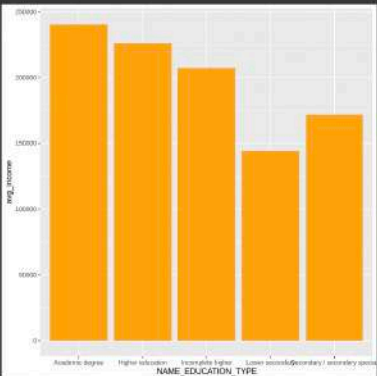
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```
ggplot(data = average_income, aes(x = NAME_EDUCATION_TYPE, y = avg_income)) +
  geom_bar(stat = "identity", fill = "orange")
```



NAME_EDUCATION_TYPE	avg_income
Academic degree	240692
Higher education	226110
Incomplete higher	207330
Lower secondary	143934
Secondary / secondary special	172057

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[37]



Find the count of applicants from different education levels. Also, showcase how many of those own a car.

[38] df2\$FLAG\_OWN\_CAR <- df2\$FLAG\_OWN\_CAR == "Y"

head(df2)

A data frame: 6 x 19

	ID	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_EDUCATION_TYPE	NAME_FAMILY_STATUS	NAME_HOUSING
	<int>	<chr>	<lg>	<chr>	<int>	<dbl>	<chr>	<chr>		<chr>
1	5008804	M	TRUE	Y	0	427500	Working	Higher education	Civil marriage	Rented apt
2	5008805	M	TRUE	Y	0	427500	Working	Higher education	Civil marriage	Rented apt
3	5008806	M	TRUE	Y	0	112500	Working	Secondary / secondary special	Married	House / apt
4	5008808	F	FALSE	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt
5	5008809	F	FALSE	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt
6	5008810	F	FALSE	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt

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[39]

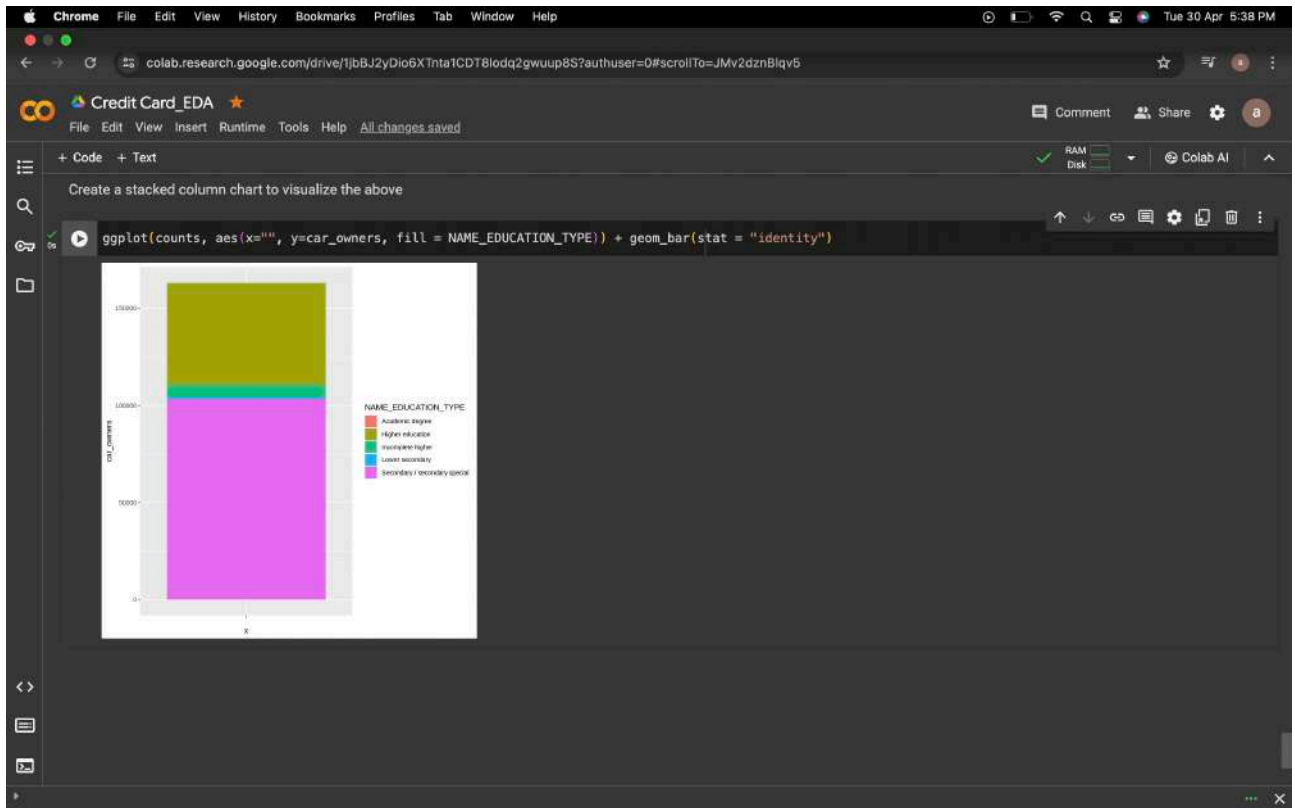
	ID	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_EDUCATION_TYPE	NAME_FAMILY_STATUS	NAME_HOUSING
	<int>	<chr>	<lg>	<chr>	<int>	<dbl>	<chr>	<chr>		<chr>
1	5008804	M	TRUE	Y	0	427500	Working	Higher education	Civil marriage	Rented apt
2	5008805	M	TRUE	Y	0	427500	Working	Higher education	Civil marriage	Rented apt
3	5008806	M	TRUE	Y	0	112500	Working	Secondary / secondary special	Married	House / apt
4	5008808	F	FALSE	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt
5	5008809	F	FALSE	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt
6	5008810	F	FALSE	Y	0	270000	Commercial associate	Secondary / secondary special	Single / not married	House / apt

[40] counts <- df2 %>%  
group\_by(NAME\_EDUCATION\_TYPE) %>%  
summarise(total\_applicants = n(), car\_owners = sum(FLAG\_OWN\_CAR))

counts

A tibble: 5 x 3

NAME_EDUCATION_TYPE	total_applicants	car_owners
<chr>	<int>	<int>
Academic degree	312	100
Higher education	117512	52271
Incomplete higher	14847	6331
Lower secondary	4051	1155
Secondary / secondary special	301788	103226



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```
[43] head(df1)
```

A data.frame: 6 x 3

	ID	MONTHS_BALANCE	STATUS
	<int>	<int>	<chr>
1	5001711	0	X
5	5001712	0	C
24	5001713	0	X
46	5001714	0	X
61	5001715	0	X
121	5001717	0	C

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Feature creation

```
[44] # Convert 'STATUS' to binary variable 'target'
df1$target <- ifelse(df1$STATUS %in% c("C", "X"), 0, 1)

[45] merged_data <- merge(df1, df2, by = "ID", all = FALSE)

[46] head(merged_data)
```

A data.frame: 6 x 22

	ID	MONTHS_BALANCE	STATUS	target	CODE_GENDER	FLAG_OWN_CAR	FLAG_OWN_REALTY	CNT_CHILDREN	AMT_INCOME_TOTAL	NAME_INCOME_TYPE	NAME_HOUSING_TYPE
	<int>	<int>	<chr>	<dbl>	<chr>	<lgl>	<chr>	<int>	<dbl>	<chr>	<chr>
1	5008804	0	C	0	M	TRUE	Y	0	427500	Working	Rented apartment
2	5008805	0	C	0	M	TRUE	Y	0	427500	Working	Rented apartment
3	5008806	0	C	0	M	TRUE	Y	0	112500	Working	House / apartment
4	5008808	0	0	0	F	FALSE	Y	0	270000	Commercial associate	House / apartment
5	5008809	-22	X	0	F	FALSE	Y	0	270000	Commercial associate	House / apartment
6	5008810	0	C	0	F	FALSE	Y	0	270000	Commercial associate	House / apartment

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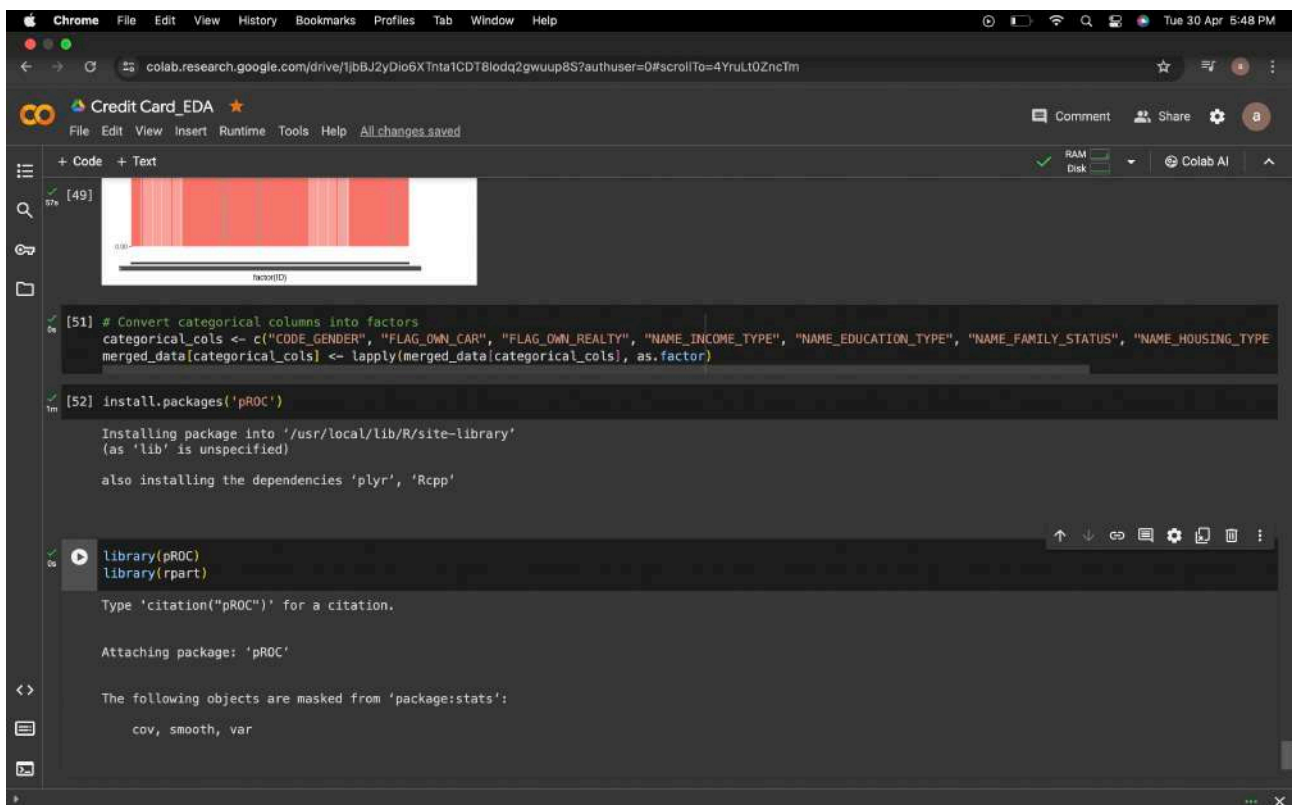
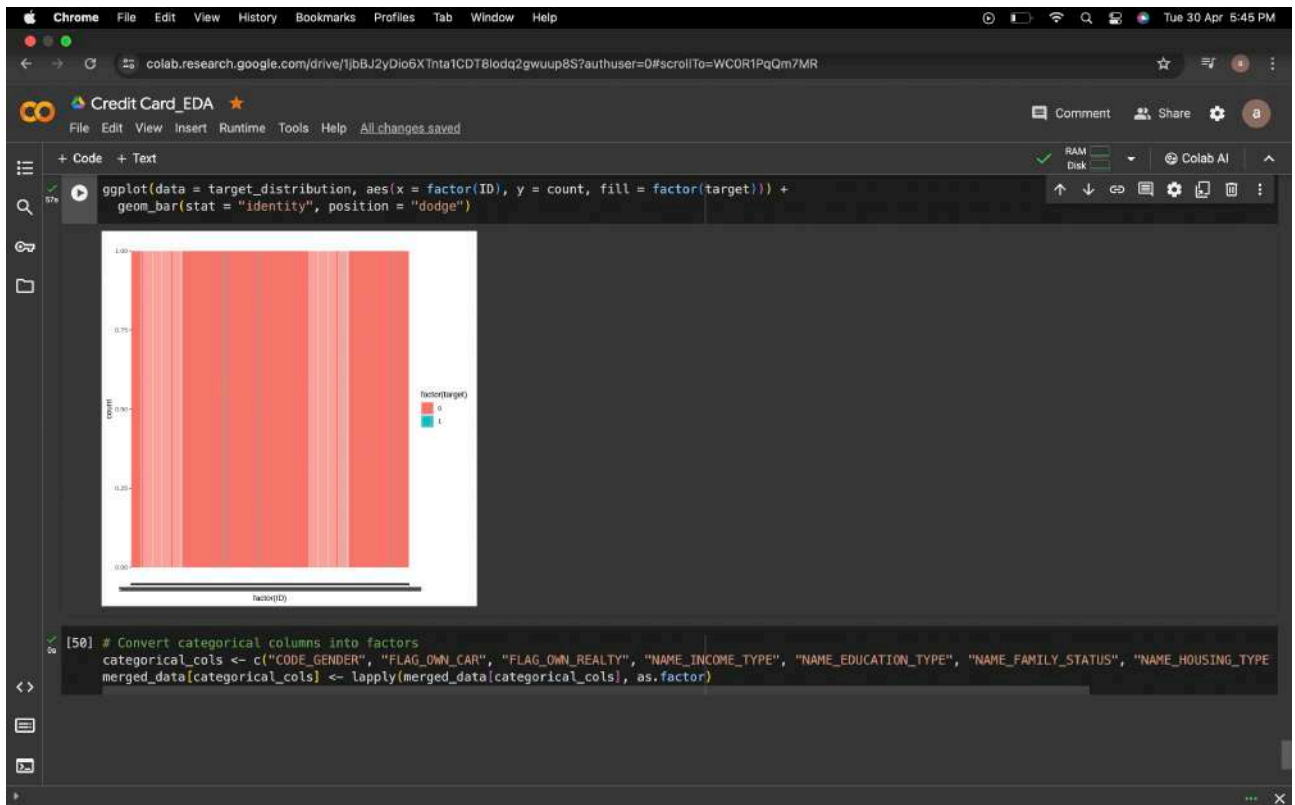
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```
target_distribution
```

ID	target
5150417	0
5150419	0
5150420	0
5150421	0
5150422	0
5150423	0
5150428	0
5150429	0
5150451	0
5150459	0
5150460	0
5150463	1
5150464	0
5150465	0
5150466	0
5150467	0
5150468	0
5150473	0
5150475	0





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colab.research.google.com/drive/1jBJ2yDio6XTnta1CDT8lodq2gwuup8S?authuser=0#scrollTo=0gCCwfruoX4A

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```
[53] Attaching package: 'pROC'
```

The following objects are masked from 'package:stats':

cov, smooth, var

```
[54] # Build decision tree classifier
model <- rpart(target ~ . - ID - STATUS, data = merged_data, method = "class")
```

```
[55] # Step 8: Get predictions
predictions <- predict(model, merged_data, type = "class")
```

```
# Calculate accuracy score
accuracy <- sum(predictions == merged_data$target) / nrow(merged_data)
accuracy
```

0.989521902515292