First Attempt

Understand the following scenario and memorize it because I will many questions from this:

IEEE-CIS Fraud Detection

Can you detect fraud from customer transactions?

Description

Imagine standing at the check-out counter at the grocery store with a long line behind you and the cashier not-so-quietly announces that your card has been declined. In this moment, you probably aren't thinking about the data science that determined your fate.

Embarrassed, and certain you have the funds to cover everything needed for an epic nacho party for 50 of your closest friends, you try your card again. Same result. As you step aside and allow the cashier to tend to the next customer, you receive a text message from your bank. "Press 1 if you really tried to spend \$500 on cheddar cheese."

While perhaps cumbersome (and often embarrassing) in the moment, this fraud prevention system is actually saving consumers millions of dollars per year. Researchers from the IEEE Computational Intelligence Society (IEEE-CIS) want to improve this figure, while also improving the customer experience. With higher accuracy fraud detection, you can get on with your chips without the hassle.

IEEE-CIS works across a variety of AI and machine learning areas, including deep neural networks, fuzzy systems, evolutionary computation, and swarm intelligence. Today they're partnering with the world's leading payment service company, Vesta Corporation, seeking the best solutions for fraud prevention industry, and now you are invited to join the challenge.

In this competition, you'll benchmark machine learning models on a challenging large-scale dataset. The data comes from Vesta's real-world e-commerce transactions and contains a wide range of features from device type to product features. You also have the opportunity to create new features to improve your results.

If successful, you'll improve the efficacy of fraudulent transaction alerts for millions of people around the world, helping hundreds of thousands of businesses reduce their fraud loss and increase their revenue. And of course, you will save party people just like you the hassle of false positives.

Vesta Corporation provided the dataset for this competition. Vesta Corporation is the forerunner in guaranteed e-commerce payment solutions. Founded in 1995, Vesta pioneered the process of fully guaranteed card-not-present (CNP) payment transactions for the telecommunications industry. Since then, Vesta has firmly expanded data science and machine learning capabilities across the globe and solidified its position as the leader in guaranteed ecommerce payments. Today, Vesta guarantees more than \$18B in transactions annually.

Evaluation

Submissions are evaluated on area under the ROC curve between the predicted probability and the observed target.

We have Four type of CSV files, train identity, train transaction, test identity and test transaction. Let explain the column of each files one by one.

Train Identity	hac the	following	column
Train identity	z nas me	TOLLOWING	column:

i i a ii i i c	activity to	as the i	Ottowning	5 COttaini	11.							
Transa	ctionID	id_01	id_02	id_03	id_04	id_05	id_06	id_07	id_08	id_09	id_10	id_11
	id_12	id_13	id_14	id_15	id_16	id_17	id_18	id_19	id_20	id_21	id_22	id_23
	id_24	id_25	id_26	id_27	id_28	id_29	id_30	id_31	id_32	id_33	id_34	id_35
	id_36	id_37	id_38	Device	Type	Device	Info					
298700)4	0	70787									100
	NotFou	ınd		-480	New	NotFoo	und	166		542	144	
						New	NotFo	und	Androi	d 7.0	samsu	ng
browse	er 6.2	32	2220x1	080	match_	_status:	2	T	F	T	T	mobile
	SAMSU	JNG SM	-G892A	Build/N	RD90M							
298700	80	-5	98945			0	-5					100
	NotFou	ınd	49	-300	New	NotFo	und	166		621	500	
						New	NotFo	und	iOS 11	.1.2	mobile	safari
11.0	32	1334x7	750	match_	_status:	1	T	F	F	T	mobile	iOS
Device												
298701	10	-5	191631	10	0	0	0			0	0	100
	NotFou	ınd	52		Found	Found	121		410	142		
					Found	Found		chrom	e 62.0			
	F	F	T	T	deskto	р	Windo	ws				
298701	11	-5	221832	2		0	-6					100
	NotFou	ınd	52		New	NotFou	und	225		176	507	
						New	NotFo	und		chrom	e 62.0	
		F	F	T	T	deskto	р					

The train transaction file has the following column:

Tra	ansactionID	isFrau	dTransa	ctionD1	Transa	ransactionAmt ProductCD card1				card2	card3	
	card4	card5	card6	addr1	addr2	dist1	dist2	P_ema	P_emaildomain		R_emaildomain	
	C1	C2	C3	C4	C5	C6	C7	C8	C9	C10	C11	C12
	C13	C14	D1	D2	D3	D4	D5	D6	D7	D8	D9	D10
	D11	D12	D13	D14	D15	M1	M2	М3	M4	M5	M6	M7
	M8	M9	V1	V2	V3	V4	V5	V6	V7	V8	V9	V10
	V11	V12	V13	V14	V15	V16	V17	V18	V19	V20	V21	V22
	V23	V24	V25	V26	V27	V28	V29	V30	V31	V32	V33	V34
	V35	V36	V37	V38	V39	V40	V41	V42	V43	V44	V45	V46
	V47	V48	V49	V50	V51	V52	V53	V54	V55	V56	V57	V58
	V59	V60	V61	V62	V63	V64	V65	V66	V67	V68	V69	V70
	V71	V72	V73	V74	V75	V76	V77	V78	V79	V80	V81	V82
	V83	V84	V85	V86	V87	V88	V89	V90	V91	V92	V93	V94
	V95	V96	V97	V98	V99	V100	V101	V102	V103	V104	V105	V106
	V107	V108	V109	V110	V111	V112	V113	V114	V115	V116	V117	V118
	V119	V120	V121	V122	V123	V124	V125	V126	V127	V128	V129	V130
	V131	V132	V133	V134	V135	V136	V137	V138	V139	V140	V141	V142

	V143	V144	V145	V146	V147	V148	V149	V150	V151	V152	V153	V154
	V155	V156	V157	V158	V159	V160	V161	V162	V163	V164	V165	V166
	V167	V168	V169	V170	V171	V172	V173	V174	V175	V176	V177	V178
	V179	V180	V181	V182	V183	V184	V185	V186	V187	V188	V189	V190
	V191	V192	V193	V194	V195	V196	V197	V198	V199	V200	V201	V202
	V203	V204	V205	V206	V207	V208	V209	V210	V211	V212	V213	V214
	V215	V216	V217	V218	V219	V220	V221	V222	V223	V224	V225	V226
	V227	V228	V229	V230	V231	V232	V233	V234	V235	V236	V237	V238
	V239	V240	V241	V242	V243	V244	V245	V246	V247	V248	V249	V250
	V251	V252	V253	V254	V255	V256	V257	V258	V259	V260	V261	V262
	V263	V264	V265	V266	V267	V268	V269	V270	V271	V272	V273	V274
	V275	V276	V277	V278	V279	V280	V281	V270	V271	V272	V275	V274 V286
	V273	V270 V288	V277	V270	V273	V200 V292	V293	V202 V294	V205 V295	V204 V296	V203 V297	V298
	V299	V200	V203 V301	V230 V302	V231	V232 V304	V295 V305	V294 V306	V293 V307	V230 V308	V297 V309	V230 V310
	V299	V300 V312	V301 V313	V302 V314	V303 V315	V304 V316	V303 V317	V300 V318	V307 V319	V300 V320	V309 V321	V310 V322
	V323	V324	V325	V326	V327	V328	V329	V330	V331	V332	V333	V334
	V335	V336	V337	V338	V339	10000		150	-l:		1.40	- u - al:4
298700		0	86400	68.5	W	13926	4	150	discov		142	credit
	315	87	19	0	0	0	1	1	0	0	0	1
	0	0	1	0	2	0	1	1	14		13 -	_
	_		_	_	13	13				0	T	T
	T	M2	F	T				1	1	1	1	1
	1	1	1	1	0	0	1	1	1	0	0	0
	0	1	1	0	0	1	1	1	1	0	0	0
	0	0	0	0	0							
											1	1
	1	1	0	0	0	0	1	1	0	0	1	1
	1	0	0	0	0	0	0	0	1	1	1	1
	0	0	0	0	0	0	0	1	1	1	0	0
	0	0	0	0	0	1	0	0	0	0	0	1
	0	0	0	0	1	1	1	1	1	1	1	1
	1	1	1	1	1	1	1	1	1	1	1	0
	117	0	0	0	0	0	117	0	0	0	0	
										0	0	0
	1	1	0	0	0	0	0	0	1	1	1	0
	1	0	0	0	0	0	0	0	0	0	0	1
	0	117	0	0	0	0	0	0	0	0	0	117
	-		-	-	-	-	-	-	-	_	-	

```
The target variable is Fraud. The test identity and test transaction has the same column except
                     isFraud. they don't have isFraud column and we have to predict the isFraud.
                     Now train the best model and predict is Fraud in test identity and test transaction
Second Attempt
Third Attempt
                     I got the following error while training with the following code:
                     # Initialize and train the model
                     model = RandomForestClassifier(n_estimators=100, random_state=42)
                     model.fit(X_train, y_train)
                     # Validate the model
                     y_val_pred = model.predict_proba(X_val)[:, 1]
                     auc_score = roc_auc_score(y_val, y_val_pred)
                     print(f'Validation AUC Score: {auc_score}')
                     ValueError
                                               Traceback (most recent call last)
                     ~\AppData\Local\Temp\ipykernel_25712\2249396114.py in ?()
                     ----> 3 # Initialize and train the model
                        4 model = RandomForestClassifier(n_estimators=100, random_state=42)
                        5 model.fit(X_train, y_train)
                        6
                     ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py in ?(estimator, *args, **kwargs)
                       1148
                                    skip_parameter_validation=(
                       1149
                                      prefer_skip_nested_validation or global_skip_validation
                       1150
                                   )
                       1151
                                 ):
                                     return fit_method(estimator, *args, **kwargs)
                     -> 1152
                     ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\ensemble\_forest.py in ?(self, X, y,
                     sample_weight)
                       344
                       345
                               # Validate or convert input data
                       346
                               if issparse(y):
                       347
                                 raise ValueError("sparse multilabel-indicator for y is not supported.")
                     --> 348
                                X, y = self._validate_data(
                       349
                                 X, y, multi_output=True, accept_sparse="csc", dtype=DTYPE
                       350
                       351
                               if sample_weight is not None:
                     ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py in ?(self, X, y, reset,
                     validate_separately, cast_to_ndarray, **check_params)
                       618
                                   if "estimator" not in check_y_params:
```

```
check_y_params = {**default_check_params, **check_y_params}
 619
 620
             y = check_array(y, input_name="y", **check_y_params)
 621
           else:
--> 622
              X, y = \text{check}_X_y(X, y, **\text{check}_params)
 623
           out = X, y
 624
 625
         if not no_val_X and check_params.get("ensure_2d", True):
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\validation.py in ?(X, y, accept_sparse,
accept_large_sparse, dtype, order, copy, force_all_finite, ensure_2d, allow_nd, multi_output,
ensure_min_samples, ensure_min_features, y_numeric, estimator)
 1142
          raise ValueError(
 1143
            f"{estimator_name} requires y to be passed, but the target y is None"
 1144
          )
 1145
-> 1146 X = check_array(
 1147
         Χ,
 1148
          accept_sparse=accept_sparse,
 1149
          accept_large_sparse=accept_large_sparse,
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\validation.py in ?(array, accept sparse,
accept_large_sparse, dtype, order, copy, force_all_finite, ensure_2d, allow_nd,
ensure_min_samples, ensure_min_features, estimator, input_name)
 913
               array = xp.astype(array, dtype, copy=False)
 914
             else:
 915
               array = _asarray_with_order(array, order=order, dtype=dtype, xp=xp)
 916
           except ComplexWarning as complex_warning:
--> 917
              raise ValueError(
 918
               "Complex data not supported\n{}\n".format(array)
 919
             ) from complex_warning
 920
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\_array_api.py in ?(array, dtype, order,
copy, xp)
 376
         # Use NumPy API to support order
 377
         if copy is True:
 378
           array = numpy.array(array, order=order, dtype=dtype)
 379
         else:
--> 380
            array = numpy.asarray(array, order=order, dtype=dtype)
 381
 382
         # At this point array is a NumPy ndarray. We convert it to an array
 383
         # container that is consistent with the input's namespace.
~\Anaconda3\envs\MLPR\lib\site-packages\pandas\core\generic.py in ?(self, dtype)
 1996 def __array__(self, dtype: npt.DTypeLike | None = None) -> np.ndarray:
 1997
          values = self._values
-> 1998
           arr = np.asarray(values, dtype=dtype)
 1999
          if (
```

```
2000
            astype_is_view(values.dtype, arr.dtype)
 2001
            and using_copy_on_write()
ValueError: could not convert string to float: 'W'
The particular datatype is give below.
# Fill missing values
train_data.fillna(-999, inplace=True)
test_data.fillna(-999, inplace=True)
# Convert categorical features to numerical
categorical_features = ['DeviceType', 'DeviceInfo'] # Add more categorical features if needed
for feature in categorical_features:
  train_data[feature] = train_data[feature].astype('category').cat.codes
  test_data[feature] = test_data[feature].astype('category').cat.codes
# Define features and target variable
X = train_data.drop(columns=['TransactionID', 'isFraud'])
y = train_data['isFraud']
X_test = test_data.drop(columns=['TransactionID'])
TransactionID
                 int64
id_01
           float64
id_02
           float64
id_03
           float64
id_04
           float64
id_05
           float64
id_06
           float64
id_07
           float64
id_08
           float64
id 09
           float64
id_10
           float64
id_11
           float64
id_12
           object
id_13
           float64
id_14
           float64
id_15
           object
id_16
           object
id_17
           float64
id_18
           float64
id_19
           float64
id 20
           float64
id_21
           float64
```

id 22

id_23

id 24

float64

object

float64

id_: id_:	
_	00 (1 104
1	
id_2	·
id_2	·
id_2	·
id_3	30 object
id_3	31 object
id_3	32 float64
id_3	.33 object
id_3	·
id_3	·
id_3	·
id_3	
id_3	·
	viceType object
	viceInfo object
	pe: object
	insactionID int64
	raud int64
Tra	insactionDT int64
Tra	insactionAmt float64
Pro	oductCD object
	•
V33	35 float64
V33	
V33	
V33	
V33	
	ngth: 394, dtype: object
- I	dentify columns with non-numeric data
	n_numeric_columns = X.select_dtypes(include=['object']).columns
prir	nt(f"Non-numeric columns: {non_numeric_columns}")
# C	Convert categorical features to numeric
for	feature in non_numeric_columns:
x	([feature] = X[feature].astype('category').cat.codes
x	(_test[feature] = X_test[feature].astype('category').cat.codes
# Fi	ill remaining missing values
	illna(-999, inplace=True)
	test.fillna(-999, inplace=True)
^_0	and the state of t
	insure that all data is numeric
1	nt(X.dtypes)
prir	nt(X_test.dtypes)

```
KeyError
                        Traceback (most recent call last)
File ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\core\indexes\base.py:3653, in
Index.get_loc(self, key)
 3652 try:
-> 3653 return self._engine.get_loc(casted_key)
 3654 except KeyError as err:
File ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\_libs\index.pyx:147, in
pandas._libs.index.IndexEngine.get_loc()
File ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\_libs\index.pyx:176, in
pandas._libs.index.IndexEngine.get_loc()
File pandas\_libs\hashtable_class_helper.pxi:7080, in
pandas._libs.hashtable.PyObjectHashTable.get_item()
File pandas\_libs\hashtable_class_helper.pxi:7088, in
pandas._libs.hashtable.PyObjectHashTable.get_item()
KeyError: 'id_12'
The above exception was the direct cause of the following exception:
KeyError
                        Traceback (most recent call last)
Cell In[11], line 8
  6 for feature in non_numeric_columns:
  7 X[feature] = X[feature].astype('category').cat.codes
----> 8 X_test[feature] = X_test[feature].astype('category').cat.codes
  10 # Fill remaining missing values
  11 X.fillna(-999, inplace=True)
File ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\core\frame.py:3761, in
DataFrame.__getitem__(self, key)
 3759 if self.columns.nlevels > 1:
 3760 return self._getitem_multilevel(key)
-> 3761 indexer = self.columns.get_loc(key)
 3762 if is_integer(indexer):
 3763 indexer = [indexer]
File ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\core\indexes\base.py:3655, in
Index.get_loc(self, key)
 3653 return self._engine.get_loc(casted_key)
 3654 except KeyError as err:
-> 3655 raise KeyError(key) from err
 3656 except TypeError:
 3657 # If we have a listlike key, _check_indexing_error will raise
 3658 # InvalidIndexError. Otherwise we fall through and re-raise
 3659 # the TypeError.
```

```
3660 self._check_indexing_error(key)
                     KeyError: 'id_12'
Fifth Attempt
                     from sklearn.ensemble import RandomForestClassifier
                     from sklearn.metrics import roc_auc_score
                     from sklearn.model_selection import train_test_split
                     # Define features and target variable
                     X = train_data.drop(columns=['TransactionID', 'isFraud'])
                     y = train_data['isFraud']
                     X_test = test_data.drop(columns=['TransactionID'])
                     # Split the training data into training and validation sets
                     X_train, X_val, y_train, y_val = train_test_split(X, y, test_size=0.2, random_state=42)
                     # Initialize and train the model
                     model = RandomForestClassifier(n_estimators=100, random_state=42)
                     model.fit(X_train, y_train)
                     # Validate the model
                     v_val_pred = model.predict_proba(X_val)[:, 1]
                     auc_score = roc_auc_score(y_val, y_val_pred)
                     print(f'Validation AUC Score: {auc_score}')
                     # Predict on the test set
                     test_predictions = model.predict_proba(X_test)[:, 1]
                     # Prepare submission DataFrame
                     submission = pd.DataFrame({
                       'TransactionID': test_data['TransactionID'],
                       'isFraud': test_predictions
                     })
                     # Save to CSV
                     submission.to_csv('submission.csv', index=False)
                     ValueError
                                               Traceback (most recent call last)
                     ~\AppData\Local\Temp\ipykernel_25712\180598639.py in ?()
                     ---> 15 from sklearn.ensemble import RandomForestClassifier
                        16 from sklearn.metrics import roc auc score
                        17 from sklearn.model_selection import train_test_split
                        18
                     ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py in ?(estimator, *args, **kwargs)
                       1148
                                   skip_parameter_validation=(
                       1149
                                     prefer_skip_nested_validation or global_skip_validation
```

```
1150
 1151
            ):
               return fit_method(estimator, *args, **kwargs)
-> 1152
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\ensemble\ forest.py in ?(self, X, y,
sample_weight)
         .....
 344
  345
         # Validate or convert input data
  346
         if issparse(y):
 347
           raise ValueError("sparse multilabel-indicator for y is not supported.")
--> 348
          X, y = self._validate_data(
           X, y, multi output=True, accept sparse="csc", dtype=DTYPE
  349
 350
 351
         if sample weight is not None:
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py in ?(self, X, y, reset,
validate_separately, cast_to_ndarray, **check_params)
 618
             if "estimator" not in check_y_params:
 619
               check_y_params = {**default_check_params, **check_y_params}
 620
             y = check_array(y, input_name="y", **check_y_params)
 621
           else:
--> 622
              X, y = check_X_y(X, y, **check_params)
 623
           out = X, y
 624
 625
         if not no_val_X and check_params.get("ensure_2d", True):
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\validation.py in ?(X, y, accept_sparse,
accept large sparse, dtype, order, copy, force all finite, ensure 2d, allow nd, multi output,
ensure_min_samples, ensure_min_features, y_numeric, estimator)
 1142
          raise ValueError(
 1143
            f"{estimator_name} requires y to be passed, but the target y is None"
 1144
 1145
-> 1146 X = check_array(
 1147
 1148
          accept_sparse=accept_sparse,
 1149
          accept large sparse=accept large sparse,
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\validation.py in ?(array, accept_sparse,
accept large sparse, dtype, order, copy, force all finite, ensure 2d, allow nd,
ensure_min_samples, ensure_min_features, estimator, input_name)
 913
               array = xp.astype(array, dtype, copy=False)
 914
             else:
 915
               array = _asarray_with_order(array, order=order, dtype=dtype, xp=xp)
 916
           except ComplexWarning as complex_warning:
--> 917
              raise ValueError(
 918
               "Complex data not supported\n{}\n".format(array)
 919
             ) from complex_warning
```

```
920
                      ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\_array_api.py in ?(array, dtype, order,
                      copy, xp)
                        376
                                # Use NumPy API to support order
                        377
                                if copy is True:
                        378
                                  array = numpy.array(array, order=order, dtype=dtype)
                        379
                                else:
                      --> 380
                                   array = numpy.asarray(array, order=order, dtype=dtype)
                        381
                        382
                                # At this point array is a NumPy ndarray. We convert it to an array
                        383
                                # container that is consistent with the input's namespace.
                      ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\core\generic.py in ?(self, dtype)
                       1996 def __array__(self, dtype: npt.DTypeLike | None = None) -> np.ndarray:
                       1997
                                 values = self._values
                      -> 1998
                                  arr = np.asarray(values, dtype=dtype)
                       1999
                       2000
                                   astype_is_view(values.dtype, arr.dtype)
                       2001
                                   and using_copy_on_write()
                      ValueError: could not convert string to float: 'W'
Sixth Attempt
                      # Identify columns with non-numeric data
                      non_numeric_columns_X = X.select_dtypes(include=['object']).columns
                      non numeric columns X test = X test.select dtypes(include=['object']).columns
                      print(f"Non-numeric columns in X: {non_numeric_columns_X}")
                      print(f"Non-numeric columns in X_test: {non_numeric_columns_X_test}")
                      Non-numeric columns in X: Index(['ProductCD', 'card4', 'card6', 'P_emaildomain', 'R_emaildomain',
                      'M1',
                         'M2', 'M3', 'M4', 'M5', 'M6', 'M7', 'M8', 'M9', 'id_12', 'id_15',
                         'id_16', 'id_23', 'id_27', 'id_28', 'id_29', 'id_30', 'id_31', 'id_33',
                         'id_34', 'id_35', 'id_36', 'id_37', 'id_38'],
                         dtype='object')
                      Non-numeric columns in X_test: Index(['ProductCD', 'card4', 'card6', 'P_emaildomain',
                      'R_emaildomain', 'M1',
                         'M2', 'M3', 'M4', 'M5', 'M6', 'M7', 'M8', 'M9', 'id-12', 'id-15',
                         'id-16', 'id-23', 'id-27', 'id-28', 'id-29', 'id-30', 'id-31', 'id-33',
                         'id-34', 'id-35', 'id-36', 'id-37', 'id-38'],
                         dtype='object')
7<sup>th</sup> Attempt
                      Validation AUC Score: 0.9346783032634545
                      ValueError
                                                Traceback (most recent call last)
                      Cell In[18], line 18
                        15 print(f'Validation AUC Score: {auc_score}')
                        17 # Predict on the test set
```

```
---> 18 test_predictions = model.predict_proba(X_test)[:, 1]
  20 # Prepare submission DataFrame
  21 submission = pd.DataFrame({
  22 'TransactionID': test_data['TransactionID'],
  23 'isFraud': test_predictions
  24 })
File ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\ensemble\_forest.py:865, in
ForestClassifier.predict_proba(self, X)
 863 check is fitted(self)
 864 # Check data
--> 865 X = self._validate_X_predict(X)
 867 # Assign chunk of trees to jobs
 868 n_jobs, _, _ = _partition_estimators(self.n_estimators, self.n_jobs)
File ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\ensemble\_forest.py:599, in
BaseForest._validate_X_predict(self, X)
 596 """
 597 Validate X whenever one tries to predict, apply, predict_proba."""
 598 check_is_fitted(self)
--> 599 X = self. validate_data(X, dtype=DTYPE, accept_sparse="csr", reset=False)
 600 if issparse(X) and (X.indices.dtype != np.intc or X.indptr.dtype != np.intc):
 601 raise ValueError("No support for np.int64 index based sparse matrices")
File ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py:580, in
BaseEstimator._validate_data(self, X, y, reset, validate_separately, cast_to_ndarray,
**check_params)
 509 def _validate_data(
 510 self,
 511 X="no_validation",
 (...)
 516 **check_params,
 517):
 518 """Validate input data and set or check the n_features_in_ attribute.
 519
 520 Parameters
 (...)
 578
         validated.
 579 """
--> 580 self._check_feature_names(X, reset=reset)
 582 if y is None and self._get_tags()["requires_y"]:
 583
         raise ValueError(
           f"This {self.__class__.__name__} estimator "
 584
 585
           "requires y to be passed, but the target y is None."
 586
         )
File ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py:507, in
BaseEstimator._check_feature_names(self, X, reset)
```

	502 if not missing_names and not unexpected_names:
	503 message += (
	504 "Feature names must be in the same order as they were in fit.\n"
	505)
	> 507 raise ValueError(message)
	ValueError: The feature names should match those that were passed during fit. Feature names unseen at fit time: - id-01
	- id-02
	- id-03
	- id-04
	- id-05
	Feature names seen at fit time, yet now missing:
	- id_01
	- id_02
	- id_03
	- id_04
	- id_05
8 th Attempt	# Ensure consistency in column names
o Accompt	X.columns = X.columns.str.replace('-', '_', regex=False)
	X_test.columns = X_test.columns.str.replace('-', '_', regex=False)
	# Re-check non-numeric columns after renaming
	non_numeric_columns_X = X.select_dtypes(include=['object']).columns
	non_numeric_columns_X_test = X_test.select_dtypes(include=['object']).columns
	print(f"Non-numeric columns in X: {non_numeric_columns_X}")
	print(f"Non-numeric columns in X_test: {non_numeric_columns_X_test}")
	Non-numeric columns in X: Index([], dtype='object')
	Non-numeric columns in X_test: Index([], dtype='object')
9 th Attempt	# Check if columns in X_test match those in X
	if X.columns.equals(X_test.columns):
	print("Columns in X and X_test match.")
	else:
	missing_cols = [col for col in X.columns if col not in X_test.columns]
	extra_cols = [col for col in X_test.columns if col not in X.columns]
	print(f"Missing columns in X_test: {missing_cols}")
	print(f*issing columns in X_test: {missing_cols}) print(f*Extra columns in X_test: {extra_cols}")
	printing Extra dotaining in A_toota (oxtra_oota)
	result: Columns in X and X_test match.
10 th Attempt	Columns in X and X_test match.
	ValueError Traceback (most recent call last)
	1. Indicated in the same day

```
~\AppData\Local\Temp\ipykernel_25712\3689824276.py in ?()
---> 33 from sklearn.ensemble import RandomForestClassifier
  34 from sklearn.metrics import roc auc score
  35 from sklearn.model_selection import train_test_split
  36
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py in ?(estimator, *args, **kwargs)
 1148
              skip_parameter_validation=(
 1149
                prefer_skip_nested_validation or global_skip_validation
 1150
             )
 1151
            ):
-> 1152
               return fit_method(estimator, *args, **kwargs)
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\ensemble\_forest.py in ?(self, X, y,
sample_weight)
         .....
 344
 345
         # Validate or convert input data
 346
         if issparse(y):
 347
           raise ValueError("sparse multilabel-indicator for y is not supported.")
--> 348
          X, y = self._validate_data(
  349
           X, y, multi output=True, accept sparse="csc", dtype=DTYPE
  350
 351
         if sample weight is not None:
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\base.py in ?(self, X, y, reset,
validate_separately, cast_to_ndarray, **check_params)
 618
             if "estimator" not in check_y_params:
 619
               check_y_params = {**default_check_params, **check_y_params}
 620
             y = check_array(y, input_name="y", **check_y_params)
 621
           else:
--> 622
              X, y = \text{check}_X_y(X, y, **\text{check}_params)
 623
           out = X, y
 624
 625
         if not no_val_X and check_params.get("ensure_2d", True):
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\validation.py in ?(X, y, accept_sparse,
accept_large_sparse, dtype, order, copy, force_all_finite, ensure_2d, allow_nd, multi_output,
ensure_min_samples, ensure_min_features, y_numeric, estimator)
 1142
          raise ValueError(
 1143
            f"{estimator_name} requires y to be passed, but the target y is None"
 1144
 1145
-> 1146 X = check_array(
 1147
          Χ,
 1148
          accept_sparse=accept_sparse,
          accept_large_sparse=accept_large_sparse,
 1149
```

```
~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\validation.py in ?(array, accept_sparse,
                     accept_large_sparse, dtype, order, copy, force_all_finite, ensure_2d, allow_nd,
                     ensure_min_samples, ensure_min_features, estimator, input_name)
                       913
                                    array = xp.astype(array, dtype, copy=False)
                       914
                                  else:
                       915
                                    array = _asarray_with_order(array, order=order, dtype=dtype, xp=xp)
                                 except ComplexWarning as complex_warning:
                       916
                     --> 917
                                    raise ValueError(
                       918
                                    "Complex data not supported\n{}\n".format(array)
                                  ) from complex_warning
                       919
                       920
                     ~\Anaconda3\envs\MLPR\lib\site-packages\sklearn\utils\_array_api.py in ?(array, dtype, order,
                     copy, xp)
                       376
                               # Use NumPy API to support order
                       377
                               if copy is True:
                       378
                                 array = numpy.array(array, order=order, dtype=dtype)
                       379
                     --> 380
                                  array = numpy.asarray(array, order=order, dtype=dtype)
                       381
                       382
                               # At this point array is a NumPy ndarray. We convert it to an array
                       383
                               # container that is consistent with the input's namespace.
                     ~\Anaconda3\envs\MLPR\lib\site-packages\pandas\core\generic.py in ?(self, dtype)
                      1996 def __array__(self, dtype: npt.DTypeLike | None = None) -> np.ndarray:
                      1997
                               values = self._values
                     -> 1998
                                 arr = np.asarray(values, dtype=dtype)
                      1999
                               if (
                      2000
                                 astype_is_view(values.dtype, arr.dtype)
                      2001
                                 and using_copy_on_write()
                     ValueError: could not convert string to float: 'W'
Final Step
                     import pandas as pd
                     from sklearn.ensemble import RandomForestClassifier
                     from sklearn.metrics import roc_auc_score
                     from sklearn.model_selection import train_test_split
                     # Load train_data and test_data (assuming they are already loaded)
                     # Define features and target variable
                     X = train_data.drop(columns=['TransactionID', 'isFraud'])
                     y = train data['isFraud']
                     X_test = test_data.drop(columns=['TransactionID'])
                     # Ensure consistency in column names
                     X.columns = X.columns.str.replace('-', '_', regex=False)
                     X_test.columns = X_test.columns.str.replace('-', '_', regex=False)
```

```
# Identify non-numeric columns
non_numeric_columns_X = X.select_dtypes(include=['object']).columns
non_numeric_columns_X_test = X_test.select_dtypes(include=['object']).columns
print(f"Non-numeric columns in X: {non_numeric_columns_X}")
print(f"Non-numeric columns in X_test: {non_numeric_columns_X_test}")
# Convert categorical features to numeric
for feature in non_numeric_columns_X:
  X[feature] = X[feature].astype('category').cat.codes
 X_test[feature] = X_test[feature].astype('category').cat.codes
# Fill remaining missing values with -999
X.fillna(-999, inplace=True)
X_test.fillna(-999, inplace=True)
# Check if columns in X_test match those in X
if not X.columns.equals(X_test.columns):
  missing_cols = [col for col in X.columns if col not in X_test.columns]
  extra_cols = [col for col in X_test.columns if col not in X.columns]
  if missing_cols:
    print(f"Missing columns in X_test: {missing_cols}")
  if extra_cols:
    print(f"Extra columns in X_test: {extra_cols}")
  print("Columns in X and X_test match.")
# Split the training data into training and validation sets
X_train, X_val, y_train, y_val = train_test_split(X, y, test_size=0.2, random_state=42)
# Initialize and train the model
model = RandomForestClassifier(n_estimators=100, random_state=42)
model.fit(X_train, y_train)
# Validate the model
y_val_pred = model.predict_proba(X_val)[:, 1]
auc_score = roc_auc_score(y_val, y_val_pred)
print(f'Validation AUC Score: {auc_score}')
# Predict on the test set
test_predictions = model.predict_proba(X_test)[:, 1]
# Prepare submission DataFrame
submission = pd.DataFrame({
  'TransactionID': test_data['TransactionID'],
  'isFraud': test_predictions
```

Save to CSV
submission.to_csv('submission.csv', index=False)