



UNIVERSITÀ  
DEGLI STUDI  
FIRENZE



# **HISTORICAL DATA ANALYSIS TO SUPPORT THE CLASSIFICATION OF TURBINE AND COMPRESSOR COMPONENTS AND PREDICT FUTURE DEMAND**

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# BUSINESS CONTEXT

TURBOMACHINERY& PROCESS SOLUTION

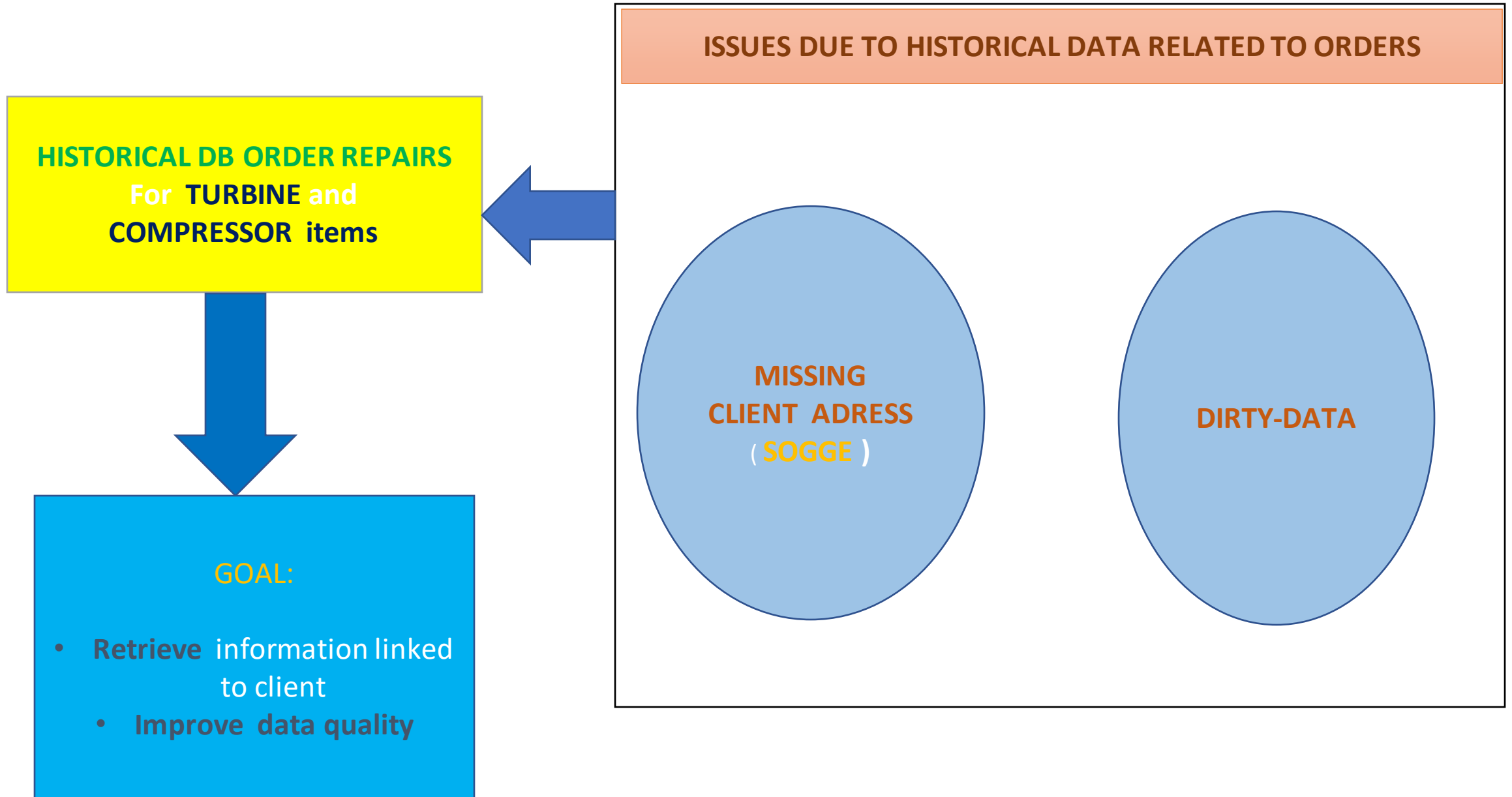
REPAIRS



SPARE PARTS



# HISTORICAL DB ORDER REPAIRS:

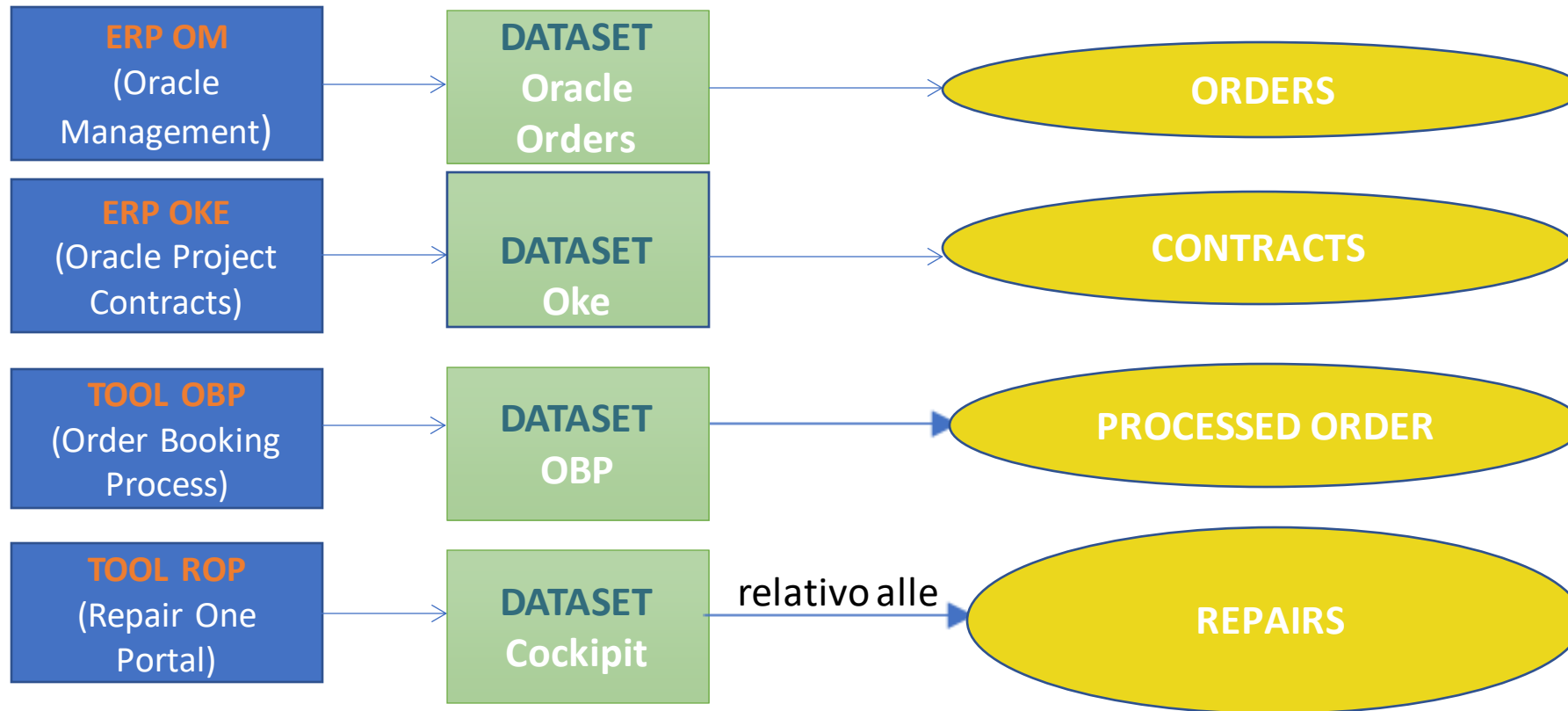


# HISTORICAL DB ORDER REPAIRS

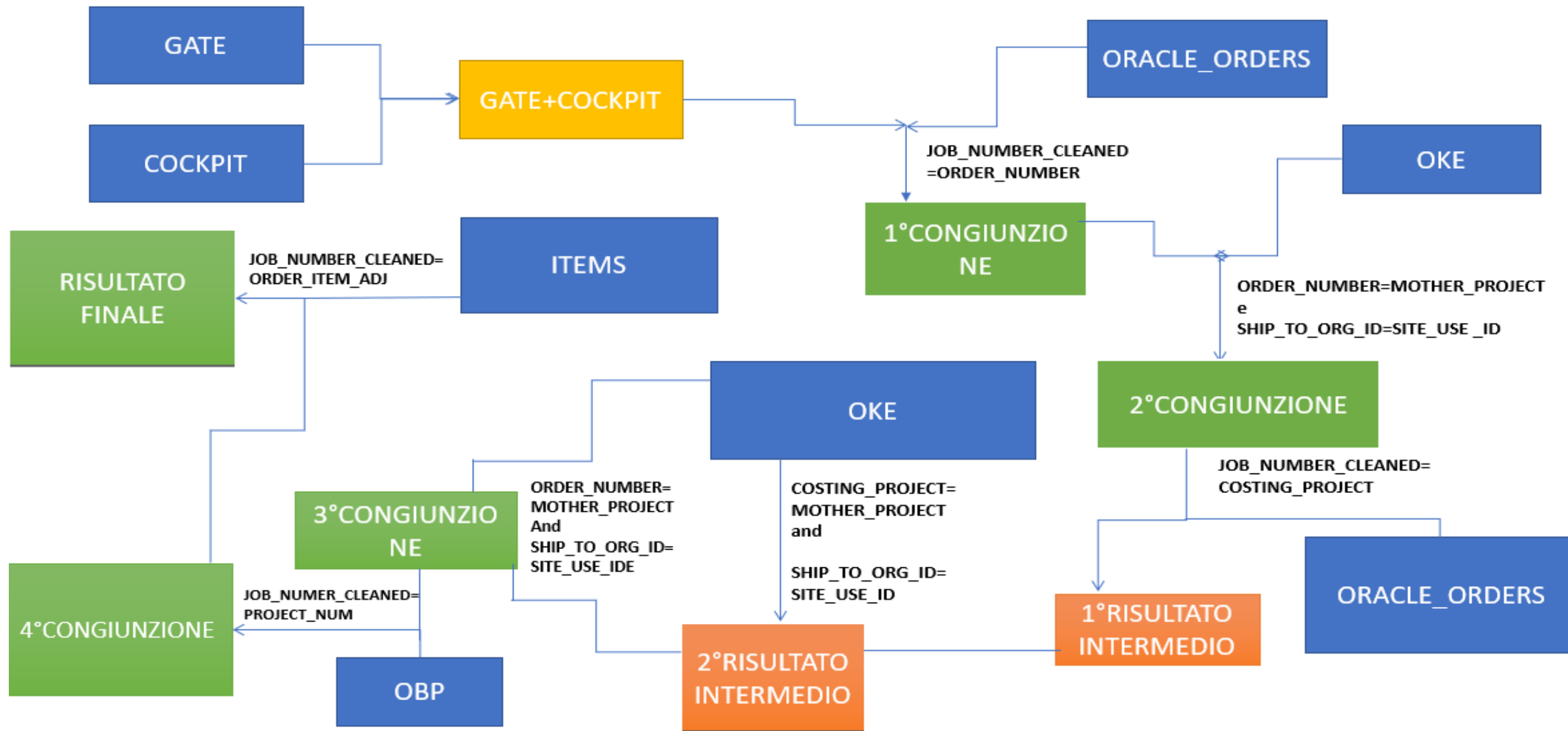
Combination from multiple DATA SOURCES :

-ERP

-TOOLS



# HISTORICAL DB ORDER REPAIRS



### Main steps:

`merge(how='left')`

- Convert data types keys
- Handle with duplicates and null values
- Data cleaning
- Remove duplicate columns

# HISTORICAL DB ORDER REPAIRS

## CONVERTING INTO STRING A DATA TYPE KEY TO ENABLE A COMBINATION

```
orders_for_repairs['ORDER_NUMBER']=orders_for_repairs['ORDER_NUMBER'].astype(int)
orders_for_repairs['ORDER_NUMBER']=orders_for_repairs['ORDER_NUMBER'].astype(str)
merge1=gate.merge(orders_for_repairs,left_on='JOB_NUMBER_CLEANED', right_on='ORDER_NUMBER', how='Left')
```

## CLEANING DATA AND REMOVING DUPLICATES VALUES

```
gate['JOB_NUMBER_CLEANED']=gate['JOB_NUMBER_CLEANED'].apply(lambda x : x.split(',')[0])
gate['JOB_NUMBER_CLEANED']=gate['JOB_NUMBER_CLEANED'].apply(lambda x : x.split(' ')[0])
gate['JOB_NUMBER_CLEANED']=gate['JOB_NUMBER_CLEANED'].apply(lambda x : x.split('/')[0])
gate['JOB_NUMBER_CLEANED']=gate['JOB_NUMBER_CLEANED'].apply(lambda x : x.split('.')[0])
gate['JOB_NUMBER_CLEANED']=gate['JOB_NUMBER_CLEANED'].apply(lambda x : x.split('-')[0])
gate['JOB_NUMBER_CLEANED']=gate['JOB_NUMBER_CLEANED'].apply(lambda x : x.split('_')[0])
gate['JOB_NUMBER_CLEANED'].drop_duplicates(inplace=True)
```

## REMOVING DUPLICATE COLUMNS

```
merge1.drop(columns='COMPONENT_CATEGORY_y',inplace=True)
merge1.rename(columns={'COMPONENT_CATEGORY_x':'COMPONENT_CATEGORY'}, inplace=True)
```

## REMOVING ROWS WITH KEY'S NULL VALUES

```
columns_cockpit=gate.columns.tolist()
columns_cockpit.append('SOGGE_Cockpit')
cols_to_remove=['CHARACT_FOUND', 'Unnamed: 27', 'Unnamed: 0', 'Unnamed: 28',
                'ITEM_CATEGORY_COCKPIT', 'ANNO_RIFERIMENTO', 'serial_number',
                'Unnamed: 26', 'PROJECT_NUMBER_COCKPIT', 'JOB_NUMBER_ADJUSTED']
columns_cockpit=list(set(columns_cockpit)-(set(cols_to_remove)))

cockpit=cockpit[columns_cockpit]
cockpit['ANNO_RIFERIMENTO']=pd.DatetimeIndex(cockpit['G3_ACTUAL_END_DATE']).year
cockpit.dropna(subset={'ANNO_RIFERIMENTO'},inplace=True)
cockpit.drop_duplicates(subset='JOB_NUMBER',inplace=True)

gate=gate.append(cockpit)

gate.to_excel('gateWithCockpit.xlsx')
```



## LIVELLO DI TESTATA (HEADER)

**LIVELLO DI COPERTURA (SHEET\_FOR\_COVERAGE\_ELAB)**

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U	V	W	
1	NUMBER	NUMBER AD	YEAR	SHOP	DER_NUMP	TO_ORG	GOGGE	OK	GGE_CoCk	COSTING	USER_SOP	SIZE	CHGE	ORACLE	GOGGE ITEM	CAT	SO_OB	NO MATCH	SOGGE_FGT	SOGGE_OJGGE OB	SOGGE_FC	SOGGE_FCOJECT	SO	SOGGE_FOUND
2	8468	8468	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
3	8678	8678	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
4	8694	8694	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
5	8807	8807	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
6	8896	8896	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
7	8897	8897	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
8	8955	8955	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
9	8958	8958	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
10	8980	8980	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
11	8996	8996	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
12	9002	9002	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
13	9015	9015	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
14	9033	9033	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
15	9039	9039	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
16	9039	9039	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
17	9045	9045	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
18	9052	9052	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
19	9059	9059	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
20	9066	9066	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
21	9068	9068	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
22	9068	9068	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
23	9074	9074	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
24	9079	9079	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
25	9090	9090	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
26	9091	9091	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
27	9092	9092	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
28	9093	9093	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
29	9093	9093	2012	TUR											MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			
															MISSING S	MISSING S	NO SOGGE NO SOGGE				NO SOGGE NO SOGGE NO SOGGE NO SOGGE			

## LIVELLO DI LINEE (LINES)

Salvataggio automatico Final\_Output\_Repairs\_File.xlsx - Excel

File Home Inserisci Layout di pagina Formule Dati Revisione Visualizza Guida

Incolla Calibri 11 A A<sup>2</sup> G C S U T % 000 + - Formattazione Formatta come condizionale Stili cella Inserisci Elimina Formato Ordina e filtra Trova e seleziona Riservatezza

AA57513

	A	B	C	D	E	F	G	H	I	J	K	L	M	N	O	P	Q	R	S	T	U	V	W	X	Y	Z	AA	AB
	LINEA	CUMPLEA	ACC	BUFFING	PER NUMBRE	NUMBRE	LINE_ID	DORED	ITCHINE	TECHINE	ACHIENTE	CABR	CATEGG	TO	ORCITE	ADDRESS	COUNTI	SOGGE	KGGS	CONC	COSTING	USER	SCP	SIZ	CHIEF	ORACLE	SGGE	ITEM
1	8468			8468			2012	TUR																				
2	8678			8678			2012	TUR																				
3	8694			8694			2012	TUR																				
4	8807			8807			2012	TUR																				
5	8896			8896			2012	TUR																				
6	8897			8897			2012	TUR																				
7	8953			8953			2012	TUR																				
8	8958			8958			2012	TUR																				
9	8980			8980			2012	TUR																				
10	8996			8996			2012	TUR																				
11	9002			9002			2012	TUR																				
12	9015			9015			2012	TUR																				
13	9033			9033			2012	TUR																				
14	9039			9039			2012	TUR																				
15	9045			9045			2012	TUR																				
16	9052			9052			2012	TUR																				
17	9059			9059			2012	TUR																				
18	9066			9066			2012	TUR																				
19	9068			9068			2012	TUR																				
20	9074			9074			2012	TUR																				
21	9079			9079			2012	TUR																				
22	9090			9090			2012	TUR																				
23	9091			9091			2012	TUR																				
24	9092			9092			2012	TUR																				
25	9093			9093			2012	TUR																				

Header Lines Sheet for Coverage ELAB



# HISTORICAL DB ORDER REPAIRS

- Significant increasing in COVERAGE of client address ([SOGGE](#))

	ALL	FLORENCE	HOUSTON
<b>DISTINCT JOB_NUMBER</b>	<i>11934</i>		
<b>DISTINCT JOB_NUMBER (2017-2020)</b>	3746	1194	443
<b>SOGGE FOUND(%) (2017-2020)</b>	84%	70%	93%
<b>NO SOGGE(%) (2017-2020)</b>	16%	30%	7%
<b>DISTINCT JOB_NUMBER (2012-2016)</b>	8201	1680	2033
<b>SOGGE FOUND(%) (2012-2016)</b>	51%	58%	45%
<b>NO SOGGE(%) (2012-2016)</b>	49%	42%	55%

# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS

Turbine & Compressor **Items CLASSIFICATION**



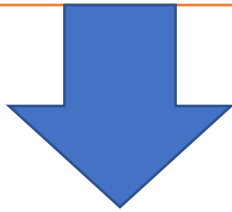
**GOAL:**

Assign a class to predict **FUTURE DEMAND**  
for **Repairs or Spare Parts**

# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS

## MAIN ISSUE

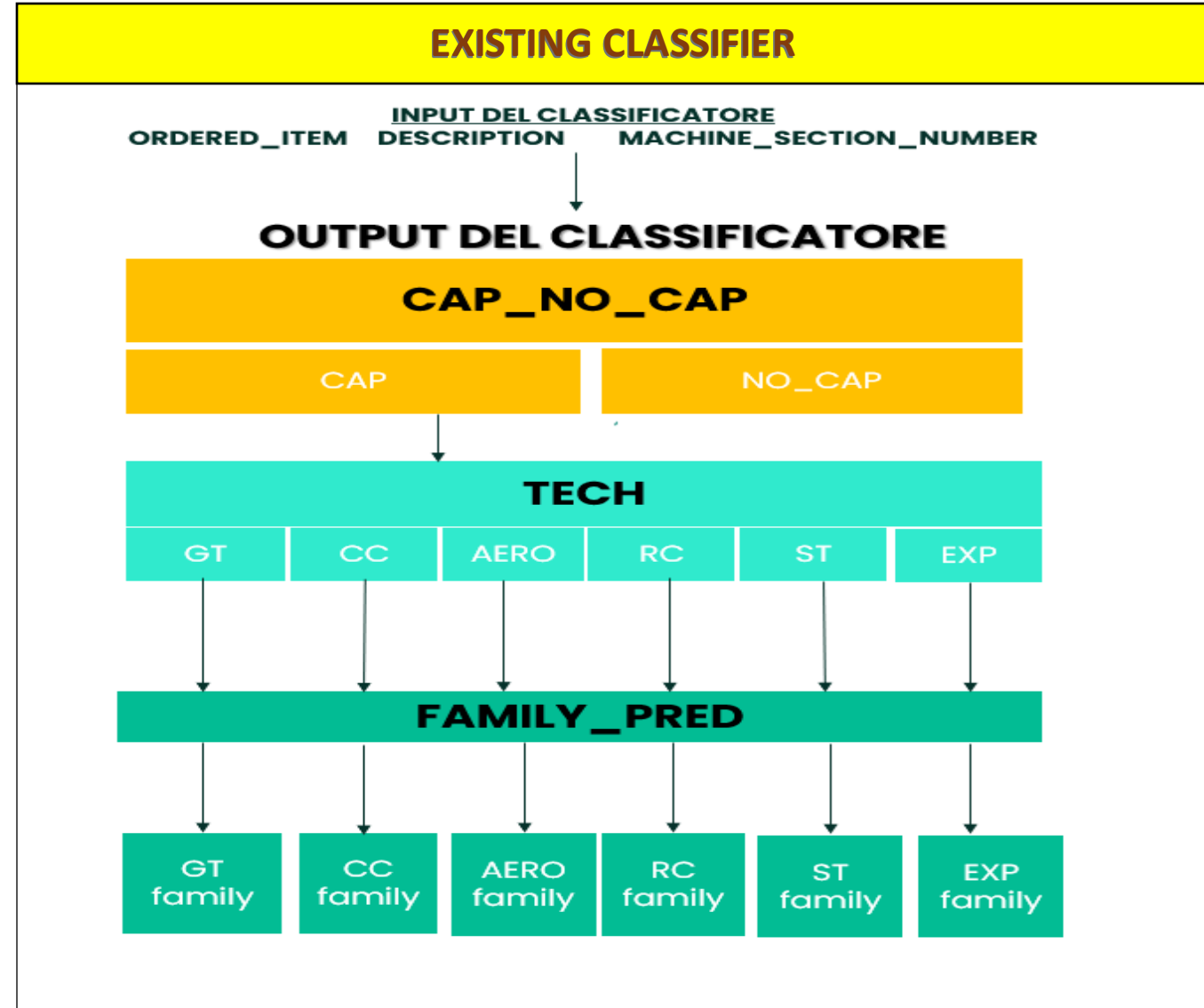
Uncorrect predictions for  
some types of classifier's  
input\_



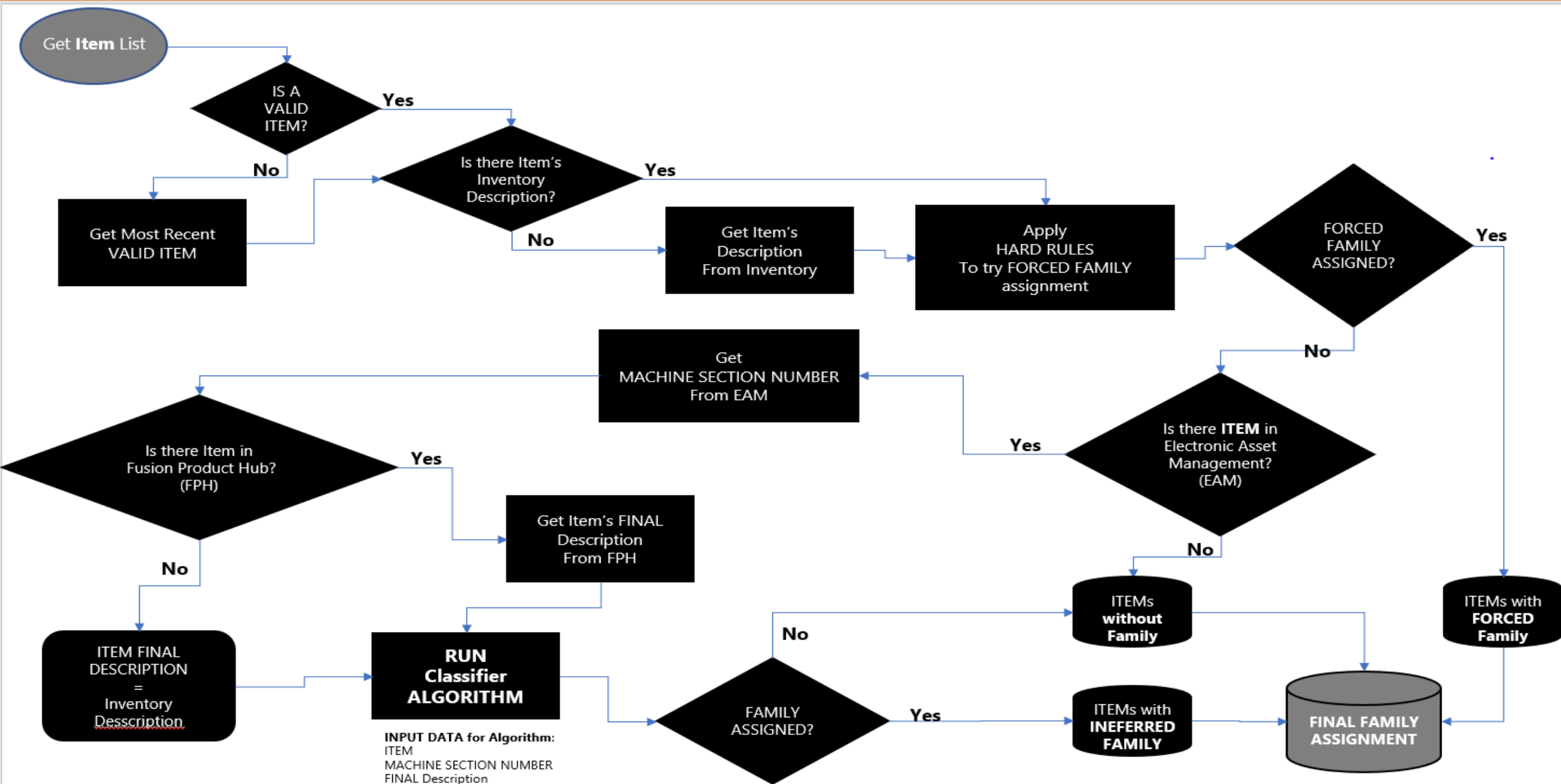
## KEY SOLUTION\_

ETL Data pipeline:

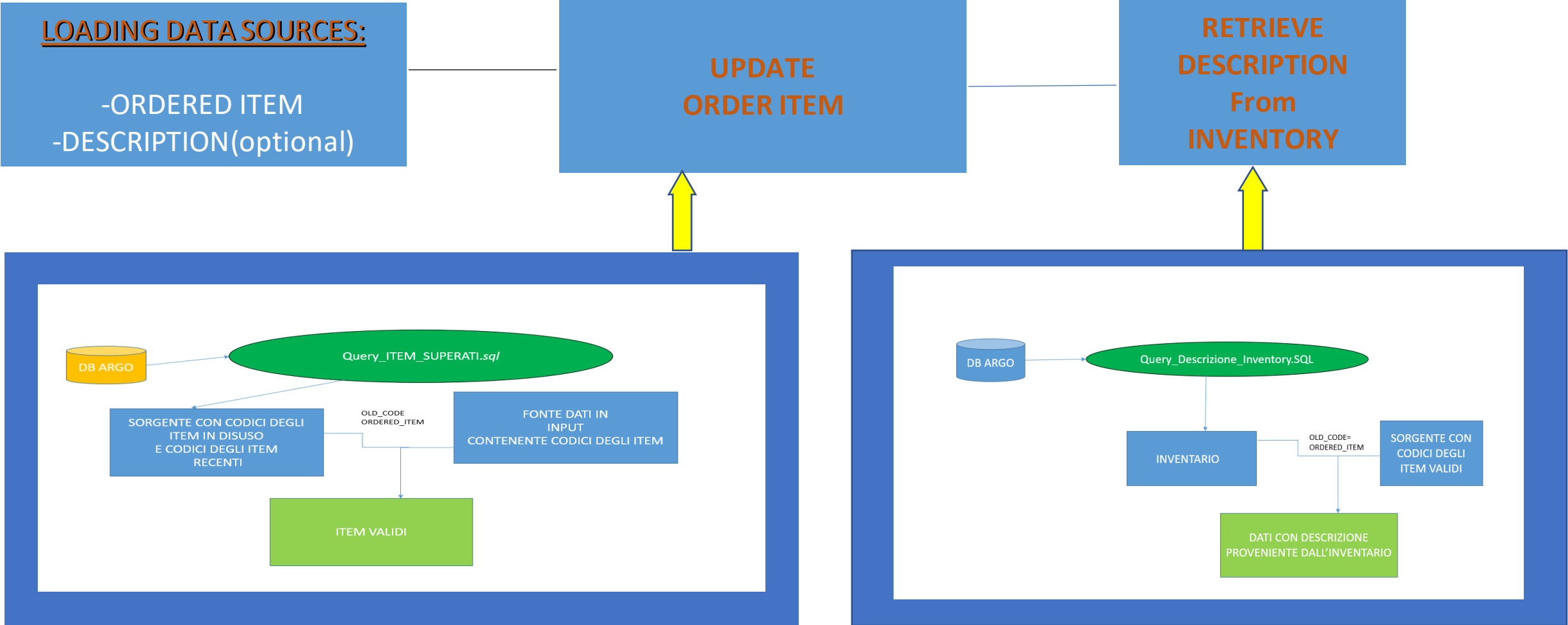
pre-processing data :



# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS



# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS



# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS

## BUSINESS LOGICS :

- identify (**NO\_CAP**) items
- assign a FAMILY

**DATI RELATIVI A COMPONENTI CHE VENGONO CLASSIFICATI SECONDO LE REGOLE DETERMINISTICHE**

**COMPONENTI APPARTENENTI AD UNA  
FAMIGLIA AUSILIARIA**

**PREFIXES OF ORDERED\_ITEM  
[I, V]**

**FAMILY\_PREDICTION=  
AUX**

**FAMILY\_PRED\_EXPLANATION  
=  
HARD\_RULES**

**CAP\_NO\_CAP=  
NO\_CAP**

**COMPONENTI APPARTENENTI AD UNA FAMIGLIA ALTERNATIVA  
RISPETTO A QUELLE PREVISTE DAL CLASSIFICATORE**

**PREFIXES OF ORDERED\_ITEM  
[N,X,Y,1,C]**

**FAMILY\_PREDICTION=  
OTH**

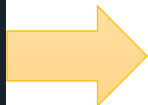
**FAMILY\_PRED\_EXPLANATION  
=  
HARD\_RULES**

**CAP\_NO\_CAP=  
NO\_CAP**

# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS

## PYTHON IMPLEMENTATION OF BUSINESS HARD RULES

```
def apply_hard_Rules(dataframe):  
  
    dataframe1=dataframe  
  
    dataframe1=dataframe1.assign(FAMILY_PREDICTION="",FAMILY_PRED_EXPLANATION="",  
                                TECH="",CAP_NOCAP="")  
  
    prefixes_aux=('I','V')  
    prefixes_oth=('N','X','Y','1C','1P','1X','1C')  
  
    item_with_Prefix_aux=dataframe1['ORDERED_ITEM'].str.startswith(prefixes_aux)  
    item_with_Prefix_oth=dataframe1['ORDERED_ITEM'].str.startswith(prefixes_oth)  
  
    dataframe1['FAMILY_PREDICTION'][item_with_Prefix_aux]="AUX"  
    dataframe1['FAMILY_PREDICTION'][item_with_Prefix_oth]="OTH"  
    dataframe1['FAMILY_PRED_EXPLANATION'][dataframe1['FAMILY_PREDICTION']!=""]="HARD RULES"  
    dataframe1['CAP_NOCAP'][dataframe1['FAMILY_PRED_EXPLANATION']=="HARD RULES"]="NO CAP"  
  
    return dataframe1
```

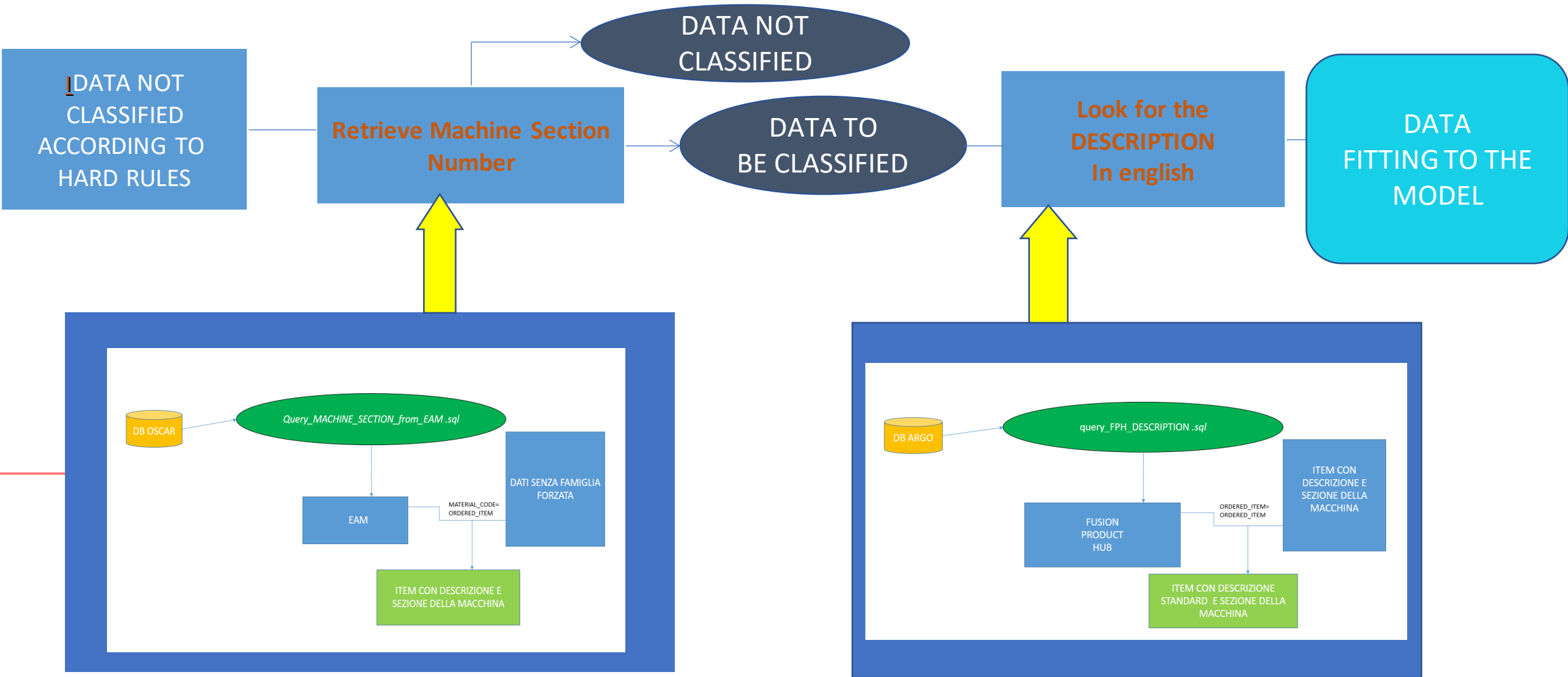


## EXAMPLE OF CLASSIFICATION MADE BY HARD RULES BASED ON BUSINESS LOGICS

ORDERED_ITEM	DESCRIPTION	FAMILY_PREDICTION	FAMILY_PRED_EXPLANATION	TECH	CAP_NOCAP
ISM021162007	BLOCK, SAFETY PARKER	AUX	HARD RULES		NO CAP
N5606P08001G11	GASKET, SPIRAL WOUND	OTH	HARD RULES		NO CAP
N14TP29024	BOLT, HEX HEAD	OTH	HARD RULES		NO CAP
N5606P02001G11	GASKET, SPIRAL WOUND	OTH	HARD RULES		NO CAP
N403P75	WASHER, LOCK-EXTERNAL TOOT	OTH	HARD RULES		NO CAP
IS200VVOH1B/RM	GAS TMR PK, MK6	AUX	HARD RULES		NO CAP
1X1308C2A000017	LABYRINTHE ENTRETOISE	OTH	HARD RULES		NO CAP
1X1308C2AC00008	JOINT DE CORPS DEPALIER COTE BUTEE	OTH	HARD RULES		NO CAP
1X1308C2A000013	LABYRINTHE OUIE ROUE 3	OTH	HARD RULES		NO CAP
ISM021162001	ACCUMULATOR, PED	AUX	HARD RULES		NO CAP
IS200VAICH1C/RM	VME ANALOG INPUT CARD (REMAN)	AUX	HARD RULES		NO CAP
1X1305A1A200001	JOINT D1 POUR GV REF:2-343	OTH	HARD RULES		NO CAP
IRJ0601721	O-RING, THERMOWELL*	AUX	HARD RULES		NO CAP
N272QP00039	BODY-BOUND LOCK NUTS	OTH	HARD RULES		NO CAP
1X1308C2AC00011	CALE DE REGLAGE PELABLE RECONSTITUEE - EP.= 3 MM	OTH	HARD RULES		NO CAP
1X1308C2AC00007	JOINT CAPOT COTE ENTRAINEMENT	OTH	HARD RULES		NO CAP
IRF318460137	SACCA *300LT 10964800225I	AUX	HARD RULES		NO CAP
ILCWBUSR0075	THRUST PAD WITH HOLE	AUX	HARD RULES		NO CAP
1X1308C2A000012	LABYRINTHE OUIE ROUE 2	OTH	HARD RULES		NO CAP



# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS



# CLASSIFICATION OF TURBINE AND COMPRESSOR ITEMS

- SPEED UP the classification task
- IMPROVE the outcome

## DATA ETL PIPELINE OVERFLOW IMPLEMENTATION

```
import pandas as pd
from hard_rules import applyHard_Rules
from items import getItemWithADescription
from items import getItemWithForcedFamily
from items import getItemWith_MSN_and_Des
from items import getInputForClassifier
from items import getItemWithoutFamily
from items import getInputForClassifier

def main():
    input_filename='C:\\Users\\dsoumat\\Desktop\\Items\\INPUT_ITEM_CODES_STEFANO@20210429.xlsx'
    data_before_HardRules=getItemWithADescription(input_filename)
    data_after_hard_rules=applyHard_Rules(data_before_HardRules)
    items_with_Forced_Family=getItemWithForcedFamily(data_after_hard_rules)
    item_without_Family=getItemWithoutFamily(data_after_hard_rules)
    items_with_Machine_Section_Number_and_Des=getItemWith_MSN_and_Des(data_after_hard_rules)
    input_data_for_classifier=getInputForClassifier(items_with_Machine_Section_Number_and_Des)
    classifier_output=pd.read_excel('C:\\Users\\dsoumat\\Desktop\\Items\\OUTPUT_CAPITAL_FAMILY.xlsx')
    classifier_output=[items_with_Forced_Family.columns]
    output=classifier_output.append(items_with_Forced_Family)
    final_family_assignment=output.append(item_without_Family)
    final_family_assignment= final_family_assignment.to_excel('final_family_assignment.xlsx')

if __name__ == "__main__":
    main()
```



## OUTPUT

**DATA CLASSIFIED  
BY HARD RULES**

**DATA  
NOT CLASSIFIED**

**DATA CLASSIFIED BY SUPERVISED MODEL**