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Факультет «Информатика и управление»

Кафедра ИУ5. Курс «Технологии машинного обучения»

Отчет по лабораторной работе №3:
«Обработка пропусков в данных, кодирование категориальных признаков, масштабирование данных»

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Подпись и дата:

Проверил:

Подпись и дата:

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1. Обработка пропусков в данных

In [3]:
```
import numpy as np
import pandas as pd
pd.set_option('display.max.rows', 1000)
import seaborn as sns
import matplotlib.pyplot as plt
%matplotlib inline
sns.set(style='ticks')
```

In [4]:
```
data = pd.read_csv('data/fifa18-all-player-statistics-2019.csv')
data.shape
```

Out[4]:
```
(18207, 89)
```

In [5]:
```
data.dtypes
```

Out[5]:

```
Unnamed: 0                  int64
ID                          int64
Name                       object
Age                         int64
Photo                      object
Nationality                object
Flag                       object
Overall                     int64
Potential                   int64
Club                       object
Club Logo                  object
Value                      object
Wage                       object
Special                     int64
Preferred Foot             object
International Reputation  float64
Weak Foot                 float64
Skill Moves               float64
Work Rate                  object
Body Type                  object
Real Face                  object
Position                   object
Jersey Number             float64
Joined                     object
Loaned From                object
Contract Valid Until       object
Height                     object
Weight                     object
LS                         object
ST                         object
RS                         object
LW                         object
LF                         object
CF                         object
RF                         object
RW                         object
LAM                        object
CAM                        object
RAM                        object
LM                         object
LCM                        object
```

```
CM                        object
RCM                       object
RM                        object
LWB                       object
LDM                       object
CDM                       object
RDM                       object
RWB                       object
LB                        object
LCB                       object
CB                        object
RCB                       object
RB                        object
Crossing                 float64
Finishing                float64
HeadingAccuracy          float64
ShortPassing             float64
Volleys                  float64
Dribbling                float64
Curve                    float64
FKAccuracy               float64
LongPassing              float64
BallControl              float64
Acceleration             float64
SprintSpeed              float64
Agility                  float64
Reactions                float64
Balance                  float64
ShotPower                float64
Jumping                  float64
Stamina                  float64
Strength                 float64
LongShots                float64
Aggression               float64
Interceptions            float64
Positioning              float64
Vision                   float64
Penalties                float64
Composure                float64
Marking                  float64
StandingTackle           float64
SlidingTackle            float64
```

```
GKDiving                 float64
GKHandling               float64
GKKicking                float64
GKPositioning            float64
GKReflexes               float64
Release Clause            object
dtype: object
```

In [6]:
```
data.isnull().sum()
```

Out[6]:

Unnamed: 0	0
ID	0
Name	0
Age	0
Photo	0
Nationality	0
Flag	0
Overall	0
Potential	0
Club	241
Club Logo	0
Value	0
Wage	0
Special	0
Preferred Foot	48
International Reputation	48
Weak Foot	48
Skill Moves	48
Work Rate	48
Body Type	48
Real Face	48
Position	60
Jersey Number	60
Joined	1553
Loaned From	16943
Contract Valid Until	289
Height	48
Weight	48
LS	2085
ST	2085
RS	2085
LW	2085
LF	2085
CF	2085
RF	2085
RW	2085
LAM	2085
CAM	2085
RAM	2085
LM	2085
LCM	2085

CM	2085
RCM	2085
RM	2085
LWB	2085
LDM	2085
CDM	2085
RDM	2085
RWB	2085
LB	2085
LCB	2085
CB	2085
RCB	2085
RB	2085
Crossing	48
Finishing	48
HeadingAccuracy	48
ShortPassing	48
Volleys	48
Dribbling	48
Curve	48
FKAccuracy	48
LongPassing	48
BallControl	48
Acceleration	48
SprintSpeed	48
Agility	48
Reactions	48
Balance	48
ShotPower	48
Jumping	48
Stamina	48
Strength	48
LongShots	48
Aggression	48
Interceptions	48
Positioning	48
Vision	48
Penalties	48
Composure	48
Marking	48
StandingTackle	48
SlidingTackle	48

```
GKDiving                    48
GKHandling                  48
GKKicking                   48
GKPositioning               48
GKReflexes                  48
Release Clause            1564
dtype: int64
```

Обработка датасета

In [7]:
```
# Удалим колонку с большим кол-вом пропусков (> 70%)
data = data.drop(columns='Loaned From')
```

In [8]:
```
# Числовые колонки с нулевыми значениями
cols_with_null_values = []
for col in data.columns:
    null_count = data[col].isnull().sum()
    if data[col].dtype in ('float64', 'int64') and null_count != 0:
        cols_with_null_values.append(col)

print('Числовые (int64, float64) колонки с нулевыми значениями:', cols_with_null_values)
```

```
Числовые (int64, float64) колонки с нулевыми значениями: ['International Reputation', 'Weak Foot', 'Skill Moves',
'Jersey Number', 'Crossing', 'Finishing', 'HeadingAccuracy', 'ShortPassing', 'Volleys', 'Dribbling', 'Curv
e', 'FKAccuracy', 'LongPassing', 'BallControl', 'Acceleration', 'SprintSpeed', 'Agility', 'Reactions', 'Bala
nce', 'ShotPower', 'Jumping', 'Stamina', 'Strength', 'LongShots', 'Aggression', 'Interceptions', 'Positionin
g', 'Vision', 'Penalties', 'Composure', 'Marking', 'StandingTackle', 'SlidingTackle', 'GKDiving', 'GKHandlin
g', 'GKKicking', 'GKPositioning', 'GKReflexes']
```

In [9]:
```
from sklearn.impute import SimpleImputer
from sklearn.impute import MissingIndicator
```

In [10]:

```
# Заполним пустые значения в числовых колонках
# используем медианную стратегию
for col in cols_with_null_values:
    indicator = MissingIndicator()
    mask_missing_values_only = indicator.fit_transform(data[[col]])
    imp_num = SimpleImputer(strategy='median')
    data[[col]] = imp_num.fit_transform(data[[col]])
```

In [11]:
```
data.isnull().sum()
```

Out[11]:

Unnamed: 0	0
ID	0
Name	0
Age	0
Photo	0
Nationality	0
Flag	0
Overall	0
Potential	0
Club	241
Club Logo	0
Value	0
Wage	0
Special	0
Preferred Foot	48
International Reputation	0
Weak Foot	0
Skill Moves	0
Work Rate	48
Body Type	48
Real Face	48
Position	60
Jersey Number	0
Joined	1553
Contract Valid Until	289
Height	48
Weight	48
LS	2085
ST	2085
RS	2085
LW	2085
LF	2085
CF	2085
RF	2085
RW	2085
LAM	2085
CAM	2085
RAM	2085
LM	2085
LCM	2085
CM	2085

RCM	2085
RM	2085
LWB	2085
LDM	2085
CDM	2085
RDM	2085
RWB	2085
LB	2085
LCB	2085
CB	2085
RCB	2085
RB	2085
Crossing	0
Finishing	0
HeadingAccuracy	0
ShortPassing	0
Volleys	0
Dribbling	0
Curve	0
FKAccuracy	0
LongPassing	0
BallControl	0
Acceleration	0
SprintSpeed	0
Agility	0
Reactions	0
Balance	0
ShotPower	0
Jumping	0
Stamina	0
Strength	0
LongShots	0
Aggression	0
Interceptions	0
Positioning	0
Vision	0
Penalties	0
Composure	0
Marking	0
StandingTackle	0
SlidingTackle	0
GKDiving	0

```
GKHandling                   0
GKKicking                    0
GKPositioning                0
GKReflexes                   0
Release Clause            1564
dtype: int64
```

In [12]:
```
# Заполним пустые значения в категориальных данных
cat_cols_with_null_values = []
for col in data.columns:
    null_count = data[col].isnull().sum()
    if data[col].dtype not in ('float64', 'int64') and null_count != 0: # object
        cat_cols_with_null_values.append(col)

print('Категориальные not(int64, float64) колонки с нулевыми значениями:', cat_cols_with_null_values)
```

```
Категориальные not(int64, float64) колонки с нулевыми значениями: ['Club', 'Preferred Foot', 'Work Rate', 'Body Ty
pe', 'Real Face', 'Position', 'Joined', 'Contract Valid Until', 'Height', 'Weight', 'LS', 'ST', 'RS', 'LW',
'LF', 'CF', 'RF', 'RW', 'LAM', 'CAM', 'RAM', 'LM', 'LCM', 'CM', 'RCM', 'RM', 'LWB', 'LDM', 'CDM', 'RDM', 'RW
B', 'LB', 'LCB', 'CB', 'RCB', 'RB', 'Release Clause']
```

In [13]:
```
# Заполним пустые значения в категориальных колонках
# используем most_frequent (мода) стратегию
for col in cat_cols_with_null_values:
    indicator = MissingIndicator()
    mask_missing_values_only = indicator.fit_transform(data[[col]])
    imp_num = SimpleImputer(strategy='most_frequent')
    data[[col]] = imp_num.fit_transform(data[[col]])
```

In [14]:
```
data.isnull().sum()
```

Out[14]:

Unnamed: 0	0
ID	0
Name	0
Age	0
Photo	0
Nationality	0
Flag	0
Overall	0
Potential	0
Club	0
Club Logo	0
Value	0
Wage	0
Special	0
Preferred Foot	0
International Reputation	0
Weak Foot	0
Skill Moves	0
Work Rate	0
Body Type	0
Real Face	0
Position	0
Jersey Number	0
Joined	0
Contract Valid Until	0
Height	0
Weight	0
LS	0
ST	0
RS	0
LW	0
LF	0
CF	0
RF	0
RW	0
LAM	0
CAM	0
RAM	0
LM	0
LCM	0
CM	0

RCM	0
RM	0
LWB	0
LDM	0
CDM	0
RDM	0
RWB	0
LB	0
LCB	0
CB	0
RCB	0
RB	0
Crossing	0
Finishing	0
HeadingAccuracy	0
ShortPassing	0
Volleys	0
Dribbling	0
Curve	0
FKAccuracy	0
LongPassing	0
BallControl	0
Acceleration	0
SprintSpeed	0
Agility	0
Reactions	0
Balance	0
ShotPower	0
Jumping	0
Stamina	0
Strength	0
LongShots	0
Aggression	0
Interceptions	0
Positioning	0
Vision	0
Penalties	0
Composure	0
Marking	0
StandingTackle	0
SlidingTackle	0
GKDiving	0

```
GKHandling                0
GKKicking                 0
GKPositioning             0
GKReflexes                0
Release Clause            0
dtype: int64
```

2. Преобразование категориальных признаков в числовые

In [15]:
```
cat_cols = []
for col in data.columns:
    if data[col].dtype == 'object':
        cat_cols.append(col)
# колонки Photo, Flag, Club Logo не представляют ценности
cat_cols.remove('Photo')
cat_cols.remove('Flag')
cat_cols.remove('Club Logo')
for col in cat_cols:
    print(col, data[col].unique())
```

```
Name ['L. Messi' 'Cristiano Ronaldo' 'Neymar Jr' ... 'B. Worman'
 'D. Walker-Rice' 'G. Nugent']
Nationality ['Argentina' 'Portugal' 'Brazil' 'Spain' 'Belgium' 'Croatia' 'Uruguay'
 'Slovenia' 'Poland' 'Germany' 'France' 'England' 'Italy' 'Egypt'
 'Colombia' 'Denmark' 'Gabon' 'Wales' 'Senegal' 'Costa Rica' 'Slovakia'
 'Netherlands' 'Bosnia Herzegovina' 'Morocco' 'Serbia' 'Algeria' 'Austria'
 'Greece' 'Chile' 'Sweden' 'Korea Republic' 'Finland' 'Guinea'
 'Montenegro' 'Armenia' 'Switzerland' 'Norway' 'Czech Republic' 'Scotland'
 'Ghana' 'Central African Rep.' 'DR Congo' 'Ivory Coast' 'Russia'
 'Ukraine' 'Iceland' 'Mexico' 'Jamaica' 'Albania' 'Venezuela' 'Japan'
 'Turkey' 'Ecuador' 'Paraguay' 'Mali' 'Nigeria' 'Cameroon'
 'Dominican Republic' 'Israel' 'Kenya' 'Hungary' 'Republic of Ireland'
 'Romania' 'United States' 'Cape Verde' 'Australia' 'Peru' 'Togo' 'Syria'
 'Zimbabwe' 'Angola' 'Burkina Faso' 'Iran' 'Estonia' 'Tunisia'
 'Equatorial Guinea' 'New Zealand' 'FYR Macedonia' 'United Arab Emirates'
 'China PR' 'Guinea Bissau' 'Bulgaria' 'Kosovo' 'South Africa'
 'Madagascar' 'Georgia' 'Tanzania' 'Gambia' 'Cuba' 'Belarus' 'Uzbekistan'
 'Benin' 'Congo' 'Mozambique' 'Honduras' 'Canada' 'Northern Ireland'
 'Cyprus' 'Saudi Arabia' 'Curacao' 'Moldova' 'Bolivia' 'Trinidad & Tobago'
 'Sierra Leone' 'Zambia' 'Chad' 'Philippines' 'Haiti' 'Comoros' 'Libya'
 'Panama' 'São Tomé & Príncipe' 'Eritrea' 'Oman' 'Iraq' 'Burundi' 'Fiji'
 'New Caledonia' 'Lithuania' 'Luxembourg' 'Korea DPR' 'Liechtenstein'
 'St Kitts Nevis' 'Latvia' 'Suriname' 'Uganda' 'El Salvador' 'Bermuda'
 'Kuwait' 'Antigua & Barbuda' 'Thailand' 'Mauritius' 'Guatemala' 'Liberia'
 'Kazakhstan' 'Niger' 'Mauritania' 'Montserrat' 'Namibia' 'Azerbaijan'
 'Guam' 'Faroe Islands' 'India' 'Nicaragua' 'Barbados' 'Lebanon'
 'Palestine' 'Guyana' 'Sudan' 'St Lucia' 'Ethiopia' 'Puerto Rico'
 'Grenada' 'Jordan' 'Rwanda' 'Qatar' 'Afghanistan' 'Hong Kong' 'Andorra'
 'Malta' 'Belize' 'South Sudan' 'Indonesia' 'Botswana']
Club ['FC Barcelona' 'Juventus' 'Paris Saint-Germain' 'Manchester United'
 'Manchester City' 'Chelsea' 'Real Madrid' 'Atlético Madrid'
 'FC Bayern München' 'Tottenham Hotspur' 'Liverpool' 'Napoli' 'Arsenal'
 'Milan' 'Inter' 'Lazio' 'Borussia Dortmund' 'Vissel Kobe'
 'Olympique Lyonnais' 'Roma' 'Valencia CF'
 'Guangzhou Evergrande Taobao FC' 'FC Porto' 'FC Schalke 04' 'Beşiktaş JK'
 'LA Galaxy' 'Sporting CP' 'Real Betis' 'Olympique de Marseille'
 'RC Celta' 'Bayer 04 Leverkusen' 'Real Sociedad' 'Villarreal CF'
 'Sevilla FC' 'SL Benfica' 'AS Saint-Étienne' 'AS Monaco' 'Leicester City'
 'Atalanta' 'Grêmio' 'Atlético Mineiro' 'RB Leipzig' 'Ajax'
 'Dalian YiFang FC' 'Everton' 'West Ham United' '1. FC Köln'
 'TSG 1899 Hoffenheim' 'Shanghai SIPG FC' 'OGC Nice' 'Al Nassr'
```

'Wolverhampton Wanderers' 'Borussia Mönchengladbach' 'Hertha BSC'
'SV Werder Bremen' 'Cruzeiro' 'Athletic Club de Bilbao' 'Torino'
'Medipol Başakşehir FK' 'Beijing Sinobo Guoan FC' 'Crystal Palace'
'PFC CSKA Moscow' 'VfL Wolfsburg' 'Shakhtar Donetsk' 'Toronto FC'
'Lokomotiv Moscow' 'Sassuolo' 'New York City FC' 'Fluminense' 'PSV'
'Levante UD' 'Fulham' 'Watford' 'Atlanta United' 'Montpellier HSC'
'Galatasaray SK' 'Fenerbahçe SK' 'SD Eibar' 'Los Angeles FC' 'Sampdoria'
'Al Hilal' 'VfB Stuttgart' 'SC Braga' 'River Plate' 'Deportivo Alavés'
'Eintracht Frankfurt' 'Girona FC' 'Guangzhou R&F; FC' 'Burnley'
'Stoke City' 'Southampton' 'Tianjin Quanjian FC' 'Getafe CF'
'Beijing Renhe FC' 'Montreal Impact' 'Chievo Verona' 'Genoa'
'Portland Timbers' 'Tigres U.A.N.L.' 'RCD Espanyol'
'Hebei China Fortune FC' 'Cagliari' 'Chicago Fire' 'DC United'
'Sagan Tosu' 'Dynamo Kyiv' 'Santos' 'Internacional'
'América FC (Minas Gerais)' 'Independiente' 'Boca Juniors' 'Cruz Azul'
'1. FSV Mainz 05' 'Bournemouth' 'Spartak Moscow' 'Racing Club'
'FC Augsburg' 'Fiorentina' 'FC Nantes' 'Feyenoord' 'Club Brugge KV'
'Brighton & Hove Albion' 'Al Ahli' 'Jiangsu Suning FC' 'SC Freiburg'
'PAOK' 'Stade Rennais FC' 'Trabzonspor' 'SPAL' 'Portimonense SC'
'Olympiacos CFP' 'Club Atlético Huracán' 'Kasimpaşa SK'
'Newcastle United' 'Frosinone' 'Querétaro' 'KRC Genk' 'Hannover 96'
'Stade Malherbe Caen' 'Godoy Cruz' 'Toulouse Football Club'
'RSC Anderlecht' 'Huddersfield Town' 'CD Tondela' 'Seattle Sounders FC'
'Hamburger SV' 'FC Red Bull Salzburg' 'Rio Ave FC'
'FC Girondins de Bordeaux' 'Melbourne Victory' 'Parma' 'FC Basel 1893'
'Al Wehda' 'BSC Young Boys' 'KAA Gent' 'Al Ittihad' 'Standard de Liège'
'Shanghai Greenland Shenhua FC' 'Colo-Colo' 'Junior FC'
'West Bromwich Albion' 'RC Strasbourg Alsace' 'Göztepe SK'
'Deportivo Cali' 'Deportivo Toluca' 'Bologna' 'Nagoya Grampus'
'Amiens SC' 'Changchun Yatai FC' 'Club Atlético Lanús' 'Botafogo'
'Club América' 'Udinese' 'Real Valladolid CF' 'CD Leganés'
'Club Atlético Banfield' 'Celtic' 'Vitória Guimarães' 'FC København'
'UD Las Palmas' 'Deportivo de La Coruña' 'Universidad Católica'
'San Lorenzo de Almagro' 'Rayo Vallecano' 'Monterrey' 'Columbus Crew SC'
'MKE Ankaragücü' 'Guizhou Hengfeng FC' 'Swansea City' 'Tianjin TEDA FC'
'Chongqing Dangdai Lifan FC SWM Team' 'AEK Athens' 'Al Taawoun'
'Melbourne City FC' 'En Avant de Guingamp' 'Akhisar Belediyespor'
'Foggia' 'LOSC Lille' '1. FC Nürnberg' 'Clube Sport Marítimo'
'Real Sporting de Gijón' 'BB Erzurumspor' 'Shandong Luneng TaiShan FC'
'Club Atlético Colón' 'Bahia' 'Once Caldas' 'FC Groningen' 'Angers SCO'
'Paraná' 'Antalyaspor' 'Minnesota United FC' 'Club León' 'Empoli'
'VVV-Venlo' 'Leeds United' 'Viktoria Plzeň' 'Alanyaspor'

'Atlético Paranaense' 'Derby County' 'Kawasaki Frontale' 'Cardiff City'
'Aston Villa' 'Guadalajara' 'Dijon FCO' 'Santos Laguna' 'Málaga CF'
'Vitória' 'Çaykur Rizespor' 'U.N.A.M.' 'Nottingham Forest'
'Royal Antwerp FC' 'Club Tijuana' 'Sport Club do Recife' 'Real Salt Lake'
'AZ Alkmaar' 'SK Slavia Praha' 'Willem II' 'Middlesbrough'
'Dinamo Zagreb' 'Club Atlas' 'Granada CF' 'Sydney FC'
'Sporting Kansas City' 'SV Zulte-Waregem' 'Philadelphia Union'
'Real Oviedo' 'Pachuca' 'Boavista FC' 'Atiker Konyaspor' 'Kaizer Chiefs'
'GD Chaves' 'Palermo' 'Atlético Nacional' 'Puebla FC' 'Perth Glory'
'Panathinaikos FC' 'FC Sion' 'Vitória de Setúbal' 'New York Red Bulls'
'Al Shabab' 'Monarcas Morelia' 'Albacete BP' 'Rangers FC' 'Sparta Praha'
'Legia Warszawa' 'Urawa Red Diamonds' 'Rosario Central' 'Stade de Reims'
'ADO Den Haag' 'Chapecoense' 'FC Midtjylland' 'San Jose Earthquakes'
'Belgrano de Córdoba' 'Brescia' 'Kashima Antlers'
'CD Everton de Viña del Mar' 'Fortuna Düsseldorf' 'SD Huesca'
'Preston North End' 'Club Atlético Talleres' 'Benevento' 'Vitesse'
'Gimnasia y Esgrima La Plata' 'Houston Dynamo' 'Club Necaxa'
'Norwich City' 'Holstein Kiel' 'Ettifaq FC' 'Kayserispor'
'1. FC Heidenheim 1846' 'Brentford' 'Yeni Malatyaspor' 'Lobos BUAP'
'Bursaspor' 'Ceará Sporting Club' 'Sheffield United' 'FC Ingolstadt 04'
'Estudiantes de La Plata' 'AIK' 'Queens Park Rangers'
'Suwon Samsung Bluewings' 'Heart of Midlothian' 'Reading' 'FC Dallas'
'Heracles Almelo' 'Venezia FC' 'CD Lugo' 'Henan Jianye FC'
'Orlando City SC' 'CA Osasuna' 'NAC Breda' 'Livorno'
'Universidad de Chile' 'Brøndby IF' 'Aberdeen' 'Defensa y Justicia'
'Atlético Tucumán' 'Blackburn Rovers' 'SV Darmstadt 98' 'Moreirense FC'
'Sanfrecce Hiroshima' 'CD Numancia' 'KV Oostende' 'FC Utrecht'
'Vancouver Whitecaps FC' 'Odense Boldklub' 'SC Heerenveen'
'Racing Club de Lens' 'Independiente Santa Fe' 'Sporting de Charleroi'
'Millonarios FC' 'Sheffield Wednesday' 'Perugia' 'Daegu FC'
'Vélez Sarsfield' 'Grasshopper Club Zürich' 'Sivasspor' 'Nîmes Olympique'
'Rosenborg BK' 'SK Sturm Graz' 'FC Metz' 'CD Universidad de Concepción'
'Hellas Verona' 'Brisbane Roar' 'CD Feirense' 'Hull City'
'Waasland-Beveren' 'Neuchâtel Xamax' 'Real Zaragoza' 'CD Aves' 'Millwall'
'Unión de Santa Fe' 'KAS Eupen' 'Cádiz CF' 'FC Tokyo' 'CD Tenerife'
'1. FC Union Berlin' 'Al Fayha' 'AJ Auxerre' 'Patriotas Boyacá FC'
'Molde FK' 'Bristol City' 'CD Nacional' 'Sporting Lokeren' 'FC St. Pauli'
'Deportes Iquique' 'Al Qadisiyah' 'Atlético Bucaramanga'
'Club Atlético Tigre' 'FK Austria Wien' 'Patronato' 'Malmö FF'
'Kashiwa Reysol' 'US Cremonese' 'VfL Bochum 1848' 'SK Rapid Wien'
'KSV Cercle Brugge' 'Rionegro Águilas' 'Gimnàstic de Tarragona' 'Lecce'
'Santa Clara' 'BK Häcken' 'New England Revolution' 'Orlando Pirates'

'Atlético Huila' 'Western Sydney Wanderers' 'Kalmar FF'
'Independiente Medellín' 'Fortuna Sittard' 'Lech Poznań' 'Djurgårdens IF'
'CF Reus Deportiu' 'SK Brann' 'Ulsan Hyundai FC' 'Sint-Truidense VV'
'Carpi' 'Al Fateh' 'Royal Excel Mouscron' 'AC Ajaccio' 'PEC Zwolle'
'Sunderland' 'Club Atlético Aldosivi' 'US Salernitana 1919' 'FC Lorient'
'Argentinos Juniors' 'AD Alcorcón' 'Crotone' 'Excelsior' 'KV Kortrijk'
'IFK Norrköping' 'Adelaide United' 'FC St. Gallen'
'Tiburones Rojos de Veracruz' 'CD Palestino' 'Jeju United FC'
'Deportes Tolima' 'Jeonbuk Hyundai Motors' 'Birmingham City'
'América de Cali' 'La Equidad' 'Spezia' 'Aalborg BK' 'Le Havre AC'
'Górnik Zabrze' 'Central Coast Mariners' 'Wigan Athletic'
'Jagiellonia Białystok' 'Cittadella' 'Hibernian' 'FC Lugano'
'San Martín de San Juan' 'Strømsgodset IF' 'Júbilo Iwata'
"Newell's Old Boys" 'Al Faisaly' 'Colorado Rapids' 'IF Elfsborg'
'SV Sandhausen' 'Al Batin' 'Stade Brestois 29' 'UD Almería'
'Gyeongnam FC' 'Yokohama F. Marinos' 'Kilmarnock' 'Pescara'
'Newcastle Jets' 'Córdoba CF' 'RCD Mallorca' 'Hammarby IF' 'Cerezo Osaka'
'KFC Uerdingen 05' 'Shimizu S-Pulse' 'MSV Duisburg' 'Os Belenenses'
'DSC Arminia Bielefeld' 'Ipswich Town' 'FC Seoul' 'Lechia Gdańsk'
'Gamba Osaka' 'CF Rayo Majadahonda' 'LASK Linz' 'Bolton Wanderers'
'Al Raed' 'Extremadura UD' 'SC Paderborn 07' 'Wellington Phoenix'
'Unión Española' 'Alianza Petrolera' 'Cracovia' 'Gangwon FC' 'Elche CF'
'ESTAC Troyes' 'AS Béziers' 'La Berrichonne de Châteauroux'
'Clermont Foot 63' '1. FC Magdeburg' 'Pohang Steelers' 'Örebro SK'
'Arka Gdynia' 'SG Dynamo Dresden' 'SpVgg Greuther Fürth' 'CD Huachipato'
'Wisła Kraków' 'Stabæk Fotball' 'Eintracht Braunschweig'
'Valenciennes FC' 'FC Thun' 'San Luis de Quillota' ' SSV Jahn Regensburg'
'Cosenza' 'FC Nordsjælland' 'FC Erzgebirge Aue' 'Jeonnam Dragons'
'Wolfsberger AC' 'Chamois Niortais Football Club' 'Club Deportes Temuco'
'AS Nancy Lorraine' 'Red Star FC' 'Al Hazem' 'Pogoń Szczecin'
'Charlton Athletic' 'Grenoble Foot 38' 'FC Hansa Rostock'
'San Martin de Tucumán' 'Incheon United FC' 'Śląsk Wrocław' 'GFC Ajaccio'
'1. FC Kaiserslautern' 'Deportivo Pasto' 'Lincoln City' 'Motherwell'
'Rotherham United' 'Burton Albion' 'Wisła Płock' 'FC Wacker Innsbruck'
'Peterborough United' 'Ascoli' 'FC Zürich' 'Fleetwood Town' 'Padova'
'FC Sochaux-Montbéliard' 'SV Wehen Wiesbaden' 'Unión La Calera'
'Scunthorpe United' "CD O'Higgins" 'CD Antofagasta' 'Plymouth Argyle'
'Aarhus GF' 'Lillestrøm SK' 'Karlsruher SC' 'GIF Sundsvall' 'FC Emmen'
'Barnsley' 'Audax Italiano' 'V-Varen Nagasaki' 'Paris FC'
'SpVgg Unterhaching' 'Hobro IK' 'De Graafschap'
'Hokkaido Consadole Sapporo' 'Tromsø IL' 'FC Luzern' 'FK Haugesund'
'Zagłębie Lubin' 'VfR Aalen' 'Dundalk' 'Oxford United' 'Piast Gliwice'

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 'Ohod Club' 'Östersunds FK' 'Vegalta Sendai' 'Crawley Town'
 'FC Admira Wacker Mödling' 'Vålerenga Fotball' 'Dundee FC' 'Portsmouth'
 'Envigado FC' 'Miedź Legnica' 'Odds BK' 'SC Fortuna Köln'
 'US Orléans Loiret Football' 'Sarpsborg 08 FF' 'Jaguares de Córdoba'
 'Bradford City' 'Accrington Stanley' 'St. Johnstone FC' 'Boyacá Chicó FC'
 'Luton Town' 'SV Mattersburg' 'Kristiansund BK' 'Sangju Sangmu FC'
 'Rochdale' 'Walsall' 'Korona Kielce' 'Shonan Bellmare'
 'FC Würzburger Kickers' 'FSV Zwickau' 'St. Mirren' 'AC Horsens'
 'Esbjerg fB' 'HJK Helsinki' 'Southend United' 'Bristol Rovers'
 'Hamilton Academical FC' 'TSV 1860 München' 'Curicó Unido' 'SCR Altach'
 'Ranheim Fotball' 'Stevenage' 'SG Sonnenhof Großaspach' 'Oldham Athletic'
 'Milton Keynes Dons' 'FK Bodø/Glimt' 'SC Preußen Münster'
 'Wycombe Wanderers' 'Vejle Boldklub' 'Bury' 'Randers FC' 'VfL Osnabrück'
 'SønderjyskE' 'IFK Göteborg' 'Mansfield Town' 'Coventry City'
 'Waterford FC' 'Shrewsbury' 'IK Start' 'Gillingham' 'FC Energie Cottbus'
 'FC Carl Zeiss Jena' 'Hallescher FC' 'SV Meppen' 'AFC Wimbledon'
 'Blackpool' 'Doncaster Rovers' 'Sandefjord Fotball'
 'VfL Sportfreunde Lotte' 'Cheltenham Town' 'IK Sirius' 'Vendsyssel FF'
 'Swindon Town' 'Notts County' 'SKN St. Pölten' 'Exeter City'
 'Northampton Town' 'Shamrock Rovers' 'Colchester United' 'Livingston FC'
 'TSV Hartberg' 'Tranmere Rovers' 'Cambridge United' 'Grimsby Town'
 'Port Vale' 'Itagüí Leones FC' 'Forest Green Rovers' 'Dalkurd FF'
 'Zagłębie Sosnowiec' 'Carlisle United' 'Trelleborgs FF'
 "St. Patrick's Athletic" 'Morecambe' 'Cork City' 'IF Brommapojkarna'
 'Crewe Alexandra' 'Yeovil Town' 'Bohemian FC' 'Macclesfield Town'
 'Newport County' 'Sligo Rovers' 'Derry City' 'Limerick FC'
 'Bray Wanderers']
Value ['€110.5M' '€77M' '€118.5M' '€72M' '€102M' '€93M' '€67M' '€80M' '€51M'
 '€68M' '€76.5M' '€44M' '€60M' '€63M' '€89M' '€83.5M' '€78M' '€58M'
 '€53.5M' '€51.5M' '€38M' '€64.5M' '€27M' '€81M' '€69.5M' '€59.5M' '€62M'
 '€73.5M' '€59M' '€46M' '€43M' '€36M' '€57M' '€24M' '€30M' '€4M' '€64M'
 '€30.5M' '€62.5M' '€52M' '€45M' '€34M' '€46.5M' '€61M' '€41.5M' '€44.5M'
 '€56.5M' '€53M' '€50M' '€55M' '€36.5M' '€45.5M' '€43.5M' '€35M' '€39M'
 '€18M' '€21.5M' '€50.5M' '€54M' '€40.5M' '€37.5M' '€28.5M' '€37M' '€32M'
 '€26M' '€33M' '€38.5M' '€35.5M' '€9M' '€15.5M' '€22M' '€14M' '€42.5M'
 '€31.5M' '€42M' '€25M' '€29.5M' '€31M' '€24.5M' '€27.5M' '€29M' '€16.5M'
 '€23M' '€19M' '€4.2M' '€40M' '€41M' '€28M' '€22.5M' '€34.5M' '€32.5M'
 '€20M' '€26.5M' '€25.5M' '€21M' '€13M' '€17.5M' '€11.5M' '€8M' '€6M'
 '€19.5M' '€6.5M' '€20.5M' '€23.5M' '€18.5M' '€17M' '€12.5M' '€15M'
 '€13.5M' '€4.8M' '€3M' '€1.5M' '€16M' '€10M' '€11M' '€7M' '€14.5M'
 '€5.5M' '€10.5M' '€4.5M' '€12M' '€0' '€9.5M' '€8.5M' '€2M' '€1.7M' '€1M'
 '€3.6M' '€7.5M' '€3.8M' '€5M' '€2.4M' '€2.9M' '€4.7M' '€4.1M' '€2.1M'
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 '€600K' '€2.7M' '€3.4M' '€2.5M' '€3.2M' '€3.1M' '€4.9M' '€4.3M' '€2.3M'
 '€525K' '€3.9M' '€1.8M' '€2.2M' '€4.4M' '€1.6M' '€900K' '€3.7M' '€3.5M'
 '€1.9M' '€450K' '€775K' '€650K' '€750K' '€2.8M' '€1.3M' '€4.6M' '€2.6M'
 '€1.2M' '€375K' '€3.3M' '€270K' '€950K' '€550K' '€1.1M' '€975K' '€1.4M'
 '€725K' '€425K' '€210K' '€875K' '€675K' '€325K' '€800K' '€850K' '€160K'
 '€120K' '€825K' '€925K' '€625K' '€240K' '€500K' '€575K' '€200K' '€250K'
 '€700K' '€350K' '€475K' '€300K' '€70K' '€140K' '€230K' '€400K' '€280K'
 '€100K' '€60K' '€260K' '€180K' '€220K' '€50K' '€290K' '€90K' '€150K'
 '€40K' '€130K' '€190K' '€170K' '€110K' '€30K' '€80K' '€20K' '€10K']
Wage ['€565K' '€405K' '€290K' '€260K' '€355K' '€340K' '€420K' '€455K' '€380K'
 '€94K' '€205K' '€125K' '€285K' '€225K' '€145K' '€240K' '€315K' '€200K'
 '€130K' '€300K' '€215K' '€100K' '€255K' '€165K' '€265K' '€160K' '€150K'
 '€245K' '€110K' '€77K' '€115K' '€210K' '€195K' '€230K' '€250K' '€135K'
 '€155K' '€180K' '€175K' '€190K' '€185K' '€21K' '€82K' '€73K' '€92K'
 '€88K' '€96K' '€170K' '€66K' '€235K' '€28K' '€105K' '€38K' '€81K' '€57K'
 '€15K' '€63K' '€22K' '€84K' '€120K' '€90K' '€72K' '€93K' '€45K' '€74K'
 '€51K' '€42K' '€31K' '€75K' '€25K' '€140K' '€41K' '€78K' '€53K' '€95K'
 '€80K' '€43K' '€60K' '€85K' '€64K' '€67K' '€18K' '€70K' '€91K' '€20K'
 '€49K' '€87K' '€86K' '€26K' '€29K' '€55K' '€35K' '€33K' '€56K' '€30K'
 '€11K' '€59K' '€23K' '€46K' '€39K' '€32K' '€36K' '€98K' '€54K' '€68K'
 '€58K' '€27K' '€40K' '€44K' '€19K' '€1K' '€61K' '€50K' '€99K' '€17K'
 '€52K' '€62K' '€12K' '€10K' '€71K' '€14K' '€76K' '€48K' '€65K' '€69K'
 '€24K' '€34K' '€16K' '€37K' '€47K' '€89K' '€0' '€97K' '€79K' '€13K'
 '€83K' '€6K' '€3K' '€9K' '€8K' '€7K' '€4K' '€2K' '€5K']
Preferred Foot ['Left' 'Right']
Work Rate ['Medium/ Medium' 'High/ Low' 'High/ Medium' 'High/ High' 'Medium/ High'
 'Medium/ Low' 'Low/ High' 'Low/ Medium' 'Low/ Low']
Body Type ['Messi' 'C. Ronaldo' 'Neymar' 'Lean' 'Normal' 'Courtois' 'Stocky'
 'PLAYER_BODY_TYPE_25' 'Shaqiri' 'Akinfenwa']
Real Face ['Yes' 'No']
Position ['RF' 'ST' 'LW' 'GK' 'RCM' 'LF' 'RS' 'RCB' 'LCM' 'CB' 'LDM' 'CAM' 'CDM'
 'LS' 'LCB' 'RM' 'LAM' 'LM' 'LB' 'RDM' 'RW' 'CM' 'RB' 'RAM' 'CF' 'RWB'
 'LWB']
Joined ['Jul 1, 2004' 'Jul 10, 2018' 'Aug 3, 2017' ... 'May 22, 2017'
 'Nov 6, 2016' 'Nov 27, 2018']
Contract Valid Until ['2021' '2022' '2020' '2023' '2019' '2024' 'Jun 30, 2019' '2025' '2026'
 'Dec 31, 2018' '2018' 'May 31, 2020' 'Jun 30, 2020' 'May 31, 2019'
 'Dec 31, 2019' 'Jan 1, 2019' 'Jun 1, 2019' 'Jan 4, 2019' 'Jan 31, 2019'
 'Jan 7, 2019' 'Jan 2, 2019' 'Jan 6, 2019' 'Oct 14, 2019' 'Jan 3, 2019'
 'May 4, 2019' 'Jan 12, 2019' 'Jan 25, 2019' 'Jan 18, 2019' 'Dec 1, 2019'
 'Nov 30, 2018' 'Feb 27, 2020' 'Jan 5, 2019' 'Jan 15, 2019' 'Jan 30, 2019'
 'Jan 11, 2019' 'Jan 20, 2019']
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Height ["5'7" "6'2" "5'9" "6'4" "5'11" "5'8" "6'0" "5'6" "5'10" "6'6" "6'1" "5'4"
 "6'3" "5'5" "6'5" "6'7" "5'3" "5'2" "6'8" "5'1" "6'9"]
Weight ['159lbs' '183lbs' '150lbs' '168lbs' '154lbs' '163lbs' '146lbs' '190lbs'
 '181lbs' '192lbs' '176lbs' '172lbs' '148lbs' '165lbs' '196lbs' '161lbs'
 '187lbs' '212lbs' '170lbs' '203lbs' '157lbs' '185lbs' '130lbs' '174lbs'
 '207lbs' '134lbs' '141lbs' '152lbs' '179lbs' '132lbs' '201lbs' '198lbs'
 '209lbs' '214lbs' '143lbs' '205lbs' '137lbs' '194lbs' '216lbs' '139lbs'
 '220lbs' '126lbs' '218lbs' '123lbs' '227lbs' '128lbs' '223lbs' '225lbs'
 '121lbs' '115lbs' '117lbs' '236lbs' '229lbs' '243lbs' '110lbs' '119lbs'
 '234lbs']
LS ['88+2' '91+3' '84+3' '61+2' '82+3' '83+3' '77+3' '87+5' '73+3' '87+3'
 '78+3' '64+3' '72+3' '86+3' '71+3' '85+3' '58+3' '80+3' '76+3' '79+3'
 '69+3' '66+3' '70+3' '52+3' '81+3' '68+3' '82+2' '75+2' '62+3' '74+3'
 '75+3' '67+3' '65+3' '61+3' '57+2' '81+2' '49+3' '74+2' '63+3' '60+3'
 '82+4' '56+2' '64+2' '77+2' '59+3' '70+2' '57+3' '72+2' '55+3' '78+2'
 '59+2' '73+2' '76+2' '52+2' '80+2' '79+2' '56+3' '53+2' '58+2' '69+2'
 '51+3' '66+2' '67+2' '68+2' '65+2' '62+2' '55+2' '71+2' '63+2' '60+2'
 '54+2' '49+2' '50+2' '51+2' '48+2' '47+2' '47+3' '46+2' '42+2' '44+2'
 '45+2' '43+2' '40+2' '39+2' '37+2' '41+2' '38+2' '36+2' '34+2' '35+2'
 '31+2' '33+2' '32+2']
ST ['88+2' '91+3' '84+3' '61+2' '82+3' '83+3' '77+3' '87+5' '73+3' '87+3'
 '78+3' '64+3' '72+3' '86+3' '71+3' '85+3' '58+3' '80+3' '76+3' '79+3'
 '69+3' '66+3' '70+3' '52+3' '81+3' '68+3' '82+2' '75+2' '62+3' '74+3'
 '75+3' '67+3' '65+3' '61+3' '57+2' '81+2' '49+3' '74+2' '63+3' '60+3'
 '82+4' '56+2' '64+2' '77+2' '59+3' '70+2' '57+3' '72+2' '55+3' '78+2'
 '59+2' '73+2' '76+2' '52+2' '80+2' '79+2' '56+3' '53+2' '58+2' '69+2'
 '51+3' '66+2' '67+2' '68+2' '65+2' '62+2' '55+2' '71+2' '63+2' '60+2'
 '54+2' '49+2' '50+2' '51+2' '48+2' '47+2' '47+3' '46+2' '42+2' '44+2'
 '45+2' '43+2' '40+2' '39+2' '37+2' '41+2' '38+2' '36+2' '34+2' '35+2'
 '31+2' '33+2' '32+2']
RS ['88+2' '91+3' '84+3' '61+2' '82+3' '83+3' '77+3' '87+5' '73+3' '87+3'
 '78+3' '64+3' '72+3' '86+3' '71+3' '85+3' '58+3' '80+3' '76+3' '79+3'
 '69+3' '66+3' '70+3' '52+3' '81+3' '68+3' '82+2' '75+2' '62+3' '74+3'
 '75+3' '67+3' '65+3' '61+3' '57+2' '81+2' '49+3' '74+2' '63+3' '60+3'
 '82+4' '56+2' '64+2' '77+2' '59+3' '70+2' '57+3' '72+2' '55+3' '78+2'
 '59+2' '73+2' '76+2' '52+2' '80+2' '79+2' '56+3' '53+2' '58+2' '69+2'
 '51+3' '66+2' '67+2' '68+2' '65+2' '62+2' '55+2' '71+2' '63+2' '60+2'
 '54+2' '49+2' '50+2' '51+2' '48+2' '47+2' '47+3' '46+2' '42+2' '44+2'
 '45+2' '43+2' '40+2' '39+2' '37+2' '41+2' '38+2' '36+2' '34+2' '35+2'
 '31+2' '33+2' '32+2']
LW ['92+2' '89+3' '63+2' '87+3' '85+3' '86+5' '70+3' '83+3' '81+3' '61+3'
 '77+3' '82+3' '74+3' '86+3' '54+3' '69+3' '84+3' '68+3' '66+3' '76+3'
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 '51+3' '79+3' '80+3' '64+3' '84+2' '65+3' '78+3' '71+3' '63+3' '57+3'
 '75+3' '56+2' '79+2' '49+3' '59+3' '77+2' '62+3' '60+3' '58+3' '77+4'
 '59+2' '51+2' '61+2' '81+2' '49+2' '83+2' '72+3' '76+2' '56+3' '82+2'
 '74+2' '62+2' '52+2' '55+3' '64+2' '78+2' '55+2' '80+2' '71+2' '44+3'
 '67+3' '60+2' '68+2' '58+2' '54+2' '72+2' '73+3' '53+3' '75+2' '50+3'
 '70+2' '73+2' '53+2' '66+2' '48+2' '65+2' '67+2' '57+2' '69+2' '48+3'
 '50+2' '52+3' '47+2' '42+2' '45+2' '41+3' '43+2' '46+2' '40+2' '44+2'
 '41+2' '38+2' '39+2' '34+2' '35+2' '36+2' '37+2' '33+2' '32+2' '28+2'
 '30+2' '31+2' '29+2' '27+2' '25+2']
LF ['93+2' '90+3' '89+3' '61+2' '87+3' '88+3' '84+3' '87+5' '71+3' '86+3'
 '82+3' '62+3' '77+3' '76+3' '83+3' '55+3' '73+3' '85+3' '69+3' '67+3'
 '81+3' '52+3' '79+3' '66+3' '84+2' '82+2' '63+3' '75+3' '70+3' '65+3'
 '78+3' '58+3' '57+2' '81+2' '48+3' '61+3' '77+2' '64+3' '80+3' '74+3'
 '59+3' '80+4' '60+2' '51+2' '63+2' '52+2' '76+2' '83+2' '68+3' '56+3'
 '59+2' '79+2' '78+2' '80+2' '53+2' '72+3' '71+2' '47+3' '65+2' '75+2'
 '73+2' '67+2' '72+2' '66+2' '55+2' '56+2' '58+2' '64+2' '62+2' '57+3'
 '74+2' '53+3' '60+3' '68+2' '70+2' '54+2' '69+2' '50+2' '51+3' '47+2'
 '48+2' '46+2' '45+2' '49+2' '43+3' '43+2' '42+2' '41+2' '40+2' '44+2'
 '39+2' '36+2' '38+2' '35+2' '37+2' '33+2' '34+2' '30+2' '31+2' '32+2'
 '27+2' '29+2']
CF ['93+2' '90+3' '89+3' '61+2' '87+3' '88+3' '84+3' '87+5' '71+3' '86+3'
 '82+3' '62+3' '77+3' '76+3' '83+3' '55+3' '73+3' '85+3' '69+3' '67+3'
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 '78+3' '58+3' '57+2' '81+2' '48+3' '61+3' '77+2' '64+3' '80+3' '74+3'
 '59+3' '80+4' '60+2' '51+2' '63+2' '52+2' '76+2' '83+2' '68+3' '56+3'
 '59+2' '79+2' '78+2' '80+2' '53+2' '72+3' '71+2' '47+3' '65+2' '75+2'
 '73+2' '67+2' '72+2' '66+2' '55+2' '56+2' '58+2' '64+2' '62+2' '57+3'
 '74+2' '53+3' '60+3' '68+2' '70+2' '54+2' '69+2' '50+2' '51+3' '47+2'
 '48+2' '46+2' '45+2' '49+2' '43+3' '43+2' '42+2' '41+2' '40+2' '44+2'
 '39+2' '36+2' '38+2' '35+2' '37+2' '33+2' '34+2' '30+2' '31+2' '32+2'
 '27+2' '29+2']
RF ['93+2' '90+3' '89+3' '61+2' '87+3' '88+3' '84+3' '87+5' '71+3' '86+3'
 '82+3' '62+3' '77+3' '76+3' '83+3' '55+3' '73+3' '85+3' '69+3' '67+3'
 '81+3' '52+3' '79+3' '66+3' '84+2' '82+2' '63+3' '75+3' '70+3' '65+3'
 '78+3' '58+3' '57+2' '81+2' '48+3' '61+3' '77+2' '64+3' '80+3' '74+3'
 '59+3' '80+4' '60+2' '51+2' '63+2' '52+2' '76+2' '83+2' '68+3' '56+3'
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 '34+2' '33+2' '31+2' '27+2' '29+2' '30+2' '28+2' '25+2']
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 '58+3' '44+3' '52+3' '81+3' '67+3' '48+3' '84+3' '51+3' '74+3' '55+3'
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 '71+3' '51+3' '81+3' '52+3' '75+3' '57+3' '63+2' '69+3' '83+3' '76+3'
 '76+2' '82+3' '59+3' '74+3' '71+2' '72+3' '51+4' '74+2' '77+2' '73+2'
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Release Clause ['€226.5M' '€127.1M' '€228.1M' ... '€74K' '€101K' '€147K']
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In [16]:
```
from sklearn.preprocessing import LabelEncoder
```

In [17]:
```
encoding_of_cat = {}
for col in cat_cols:
    le = LabelEncoder()
    data[[col]] = le.fit_transform(data[col])
    print(col, data[col].unique())
    encoding_of_cat[col] = le
```

```
Name [ 9632  3153 12508 ...  2133  3997  5807]
Nationality [  6 123  20 139  13  35 158 136 122  59  55  46  78  44  31  41  56 161
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  97 113  24  42  77  84  71 126 127 157  26   8 120 150 146 163   4  22
  75  49 152  47 110  51 156  30  66  21  87 137  96  58 148  57  36  12
 159  15  33 106  69  25 114  38 130  37 102  17 151 134 162  28 121  68
  32  92 118 147  48 116  76  23  53 109  94  95  85  93 140  89 143 154
  45  16  88   5 149 100  64  91  83 112  99 104 107  10  63  52  73 111
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  74  19]
Club [212 326 435 375 374 134 470  61 214 583 363 398  52 382 315 351  86 620
 418 482 605 280 232 234  77 346 552 469 419 457  72 473 619 530 504  19
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 511 168  56 581 377  74 169 427 616 531 582 367 527 401 254 428 359 260
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  46 312  82 167   7  89 549 462 211 252 230 251 150  95  28 324 490 425
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 529 288 233 478 220 379 436 213  41  69 328  35 564 534 157 325 632 458
 285 183 185  84 397  45 131 147  88 141 595 475 110 144 127 623 224 591
 186 597 516 467 389 159 370 282 570 578 138  12  40 378 201  27 255 348
   5 155 474  67 533 145  70 420 221  48 433  49 386 152 200 604 356 618
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  20 501 636 380 190 142 274 572 553 512 443 471 429  81  57 335 261 431
  63 453 439 432 236 624 402  39 388  43 465 548 357 602 483 563  11 132
 229 515  75  94 338 107 257 496 452 148  76 621 270 302 153 408 301 205
 342   1  93 642 366 101 126 536 223 204  14 454 569 292 468 216 296 611
 111 295 421 104 396 365 598  99  23 179  65  79 506 393 521 113 334 242
 607 414 491 463 314 555 383 537 440 175 626 275 542 411 484 502 228 118
 294  96 108 304 627 399 476 106 384 601 329 171 241 116   6  32  15 437
 387  97 112 554 239 180  37  59 149 246 438 373 339 592 613 500 332 479
 271 353 523  68 400 422  60 634 336 313 258 354 191 120 499 596 541 125
  31 487   8 426 568 143 594 225  50  10 166 207 333 308  25 238 579 115
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 327 405  30 158 306 509  29 560 590 283 644 343 441 403 172 460 290 129
 330 538 371 423 174 317 235 355 265 119 347  85  38 209 492 631 599  44
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 240 517   0 161 231 219 323 639 130 151  18 477  33 446 133 276 222 518
 311 650 262   2 184 362 394 485 102 638 243 442  53 245 253 430 237 510
 600 528 114 105 445  22 360 337 263 217  71  66 603 434 547 299 178 300
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 641 609 103 464 614 573 307 376 162 629 540 310 269 218 215 287 508  13
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 277 448 318 256 177 646 124 587 558 392 160 305 165 643  83 372 406 543
 188 361  92]
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 117  40  58 149 159 128 112  79 114 103  75 104 115 107 216  29  63  28
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 101  57  73  70  60  25  35  15 208 185  41 169  54  64  38  37  20  31
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  47 155  94   8  46 122   6 210  92  90   9 142 194 180 192  52   3 124
  50   2 113  88  77 214 160   1 215   4 189 135  59 206 181 102 199 205
  33  21 203 212 175  68 150 163  55  71 187 108 146  96 188  27  65 129
  80  11 171  74  39  62 151  83 211  30 130  24  42  36  17  97 200  56
  13]
Wage [ 94  74  55  49  66  64  77  81  70 137  33   8  53  38  14  43  60  32
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  17  25  23  28  26  37 124 114 135 130 139  22 106  41  54   2  71 123
  96  18 103  39 126   7 133 113 136  82 115  89  78  61 116  48  13  76
 119  91 138 122  79 100 127 104 107  27 111 134  34  86 129 128  51  56
  93  67  63  95  59   6  98  42  83  72  62  68 141  92 108  97  52  75
  80  30  31 101  88 142  24  90 102   9   3 112  15 117  85 105 109  45
  65  21  69  84 131   0 140 120  12 125 110  73 143 132 121  87  57  99]
Preferred Foot [0 1]
Work Rate [8 1 2 0 6 7 3 5 4]
Body Type [4 1 5 3 6 2 9 7 8 0]
Real Face [1 0]
Position [21 26 14  5 19 11 23 18  9  1 10  0  2 13  8 22  6 12  7 20 24  4 17 16
  3 25 15]
Joined [ 774  794  247 ... 1340 1487 1464]
Contract Valid Until [ 3  4  2  5  1  6 29  7  8 10  0 32 30 31 11 13 28 24 23 27 18 26 35 21
 33 15 20 17  9 34 12 25 16 22 14 19]
Height [ 8 13 10 15  2  9 11  7  1 17 12  5 14  6 16 18  4  3 19  0 20]
Weight [21 32 17 25 19 23 15 35 31 36 29 27 16 24 38 22 34 45 26 41 20 33  8 28
 43 10 13 18 30  9 40 39 44 46 14 42 11 37 47 12 49  6 48  5 52  7 50 51
  4  1  2 55 53 56  0  3 54]
LS [91 92 86 40 83 85 73 90 65 89 75 47 63 88 61 87 35 79 71 77 57 51 59 25
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 81 55 82 68 43 67 69 53 49 41 32 80 20 66 45 39 84 30 46 72 37 58 33 62
 29 74 36 64 70 24 78 76 31 26 34 56 23 50 52 54 48 42 28 60 44 38 27 19
 21 22 18 16 17 15 11 13 14 12  9  8  6 10  7  5  3  4  0  2  1]
ST [91 92 86 40 83 85 73 90 65 89 75 47 63 88 61 87 35 79 71 77 57 51 59 25
 81 55 82 68 43 67 69 53 49 41 32 80 20 66 45 39 84 30 46 72 37 58 33 62
 29 74 36 64 70 24 78 76 31 26 34 56 23 50 52 54 48 42 28 60 44 38 27 19
 21 22 18 16 17 15 11 13 14 12  9  8  6 10  7  5  3  4  0  2  1]
RS [91 92 86 40 83 85 73 90 65 89 75 47 63 88 61 87 35 79 71 77 57 51 59 25
 81 55 82 68 43 67 69 53 49 41 32 80 20 66 45 39 84 30 46 72 37 58 33 62
 29 74 36 64 70 24 78 76 31 26 34 56 23 50 52 54 48 42 28 60 44 38 27 19
 21 22 18 16 17 15 11 13 14 12  9  8  6 10  7  5  3  4  0  2  1]
LW [104 103  54 102  99 101  69  96  92  51  83  94  77 100  37  67  98  65
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RW [104 103  54 102  99 101  69  96  92  51  83  94  77 100  37  67  98  65
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  53  49  45  84  46  30  50  91  26  95  73  80  41  93  76  52  32  39
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  12   8   9   7   6   2   5   4   3   1   0]
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 92 58 93 52 85 54 60 44 43 84 30 46 80 74 48 40 77 47 29 51 88 28 82 86
 78 38 65 55 37 71 31 59 41 67 23 53 73 75 57 35 39 49 69 63 32 42 33 61
 70 27 26 22 21 25 18 19 24 17 20 12 16 14 11 15 13 10  9  2  8  7  6  5
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 66 65 78 55 41 46 84 29 51 43 64 48 28 56 82 36 71 62 35 49 73 44 54 80
 58 75 67 45 38 60 69 26 52 42 47 39 34 40 50 30 31 25 23 27 20 22 21 15
 24 14 17 18 19 16 13 11  9 10 12  8  4  5  7  6  3  1  2  0]
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 24 14 17 18 19 16 13 11  9 10 12  8  4  5  7  6  3  1  2  0]
RCM [86 81 32 90 83 91 77 68 72 89 53 88 76 79 85 70 37 74 63 87 59 33 61 57
 66 65 78 55 41 46 84 29 51 43 64 48 28 56 82 36 71 62 35 49 73 44 54 80
 58 75 67 45 38 60 69 26 52 42 47 39 34 40 50 30 31 25 23 27 20 22 21 15
 24 14 17 18 19 16 13 11  9 10 12  8  4  5  7  6  3  1  2  0]
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 78 38 65 55 37 71 31 59 41 67 23 53 73 75 57 35 39 49 69 63 32 42 33 61
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 51 90 84 88 57 86 70 43 38 49 45 37 59 39 28 31 32 34 25 27 24 26 19 22
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 27 65 36 42 66 93 75 35 31 62 37 60 58 91 30 54 33 46 52 22 67 29 71 69
 23 24 28 25 26 19 15 21 20 17 14 16 12 13 11 18  8 10  9  7  6  5  4  3
  2  1  0]
CDM [48 49 47 50 82 53 90 64 95 51 92 68 98 43 59 61 97 57 38 80 96 63 74 70
 94 32 78 84 88 86 44 56 55 83 87 45 76 81 72 41 73 85 77 39 89 34 40 79
 27 65 36 42 66 93 75 35 31 62 37 60 58 91 30 54 33 46 52 22 67 29 71 69
 23 24 28 25 26 19 15 21 20 17 14 16 12 13 11 18  8 10  9  7  6  5  4  3
  2  1  0]
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 27 65 36 42 66 93 75 35 31 62 37 60 58 91 30 54 33 46 52 22 67 29 71 69
 23 24 28 25 26 19 15 21 20 17 14 16 12 13 11 18  8 10  9  7  6  5  4  3
  2  1  0]
RWB [53 56 47 81 58 91 65 89 48 85 79 64 94 50 67 60 42 75 83 52 71 69 54 73
 35 87 33 46 93 77 55 61 92 62 40 72 80 74 44 36 68 76 63 30 78 41 66 82
 51 90 84 88 57 86 70 43 38 49 45 37 59 39 28 31 32 34 25 27 24 26 19 22
 16 14 17 23 15 20 18 13 11 12 29 10  9 21  5  6  8  7  4  2  3  1  0]
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 86 70 35 64 59 74 53 88 94 90 92 29 66 37 39 57 45 71 26 28 61 68 21 27
 24 33 18 22 20 25 17 16 14 13 23 15 11 12  9 10 19  7  5  6  8  4  3  2
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LCB [ 28  42  29  61  69  33  79  63 107  50  81 103  25  56  58 101  62 106
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  54  83  15 102  94  35  91  95  74  97  73  40 100  70  98  80  75  32
  86  17  34  36  68  90  65  14  64  45  47  78  43  19  96  60  21  92
  20  84  53  82  26  55  51  72  24  22  88  16  48  87  12  76  30  59
  66  49  57  13  67  18  11  10   9   6   8   7   5   1   3   4   2   0]
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  44 105  52  23  39  99  71  31 104  37  85  46  93  27  77  38  41  89
  54  83  15 102  94  35  91  95  74  97  73  40 100  70  98  80  75  32
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  20  84  53  82  26  55  51  72  24  22  88  16  48  87  12  76  30  59
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  54  83  15 102  94  35  91  95  74  97  73  40 100  70  98  80  75  32
  86  17  34  36  68  90  65  14  64  45  47  78  43  19  96  60  21  92
  20  84  53  82  26  55  51  72  24  22  88  16  48  87  12  76  30  59
```

```
  66  49  57  13  67  18  11  10   9   6   8   7   5   1   3   4   2   0]
RB [47 52 50 51 77 89 63 97 46 85 58 42 54 65 87 60 36 62 67 91 73 31 93 34
 81 44 55 69 96 83 82 95 48 79 72 75 32 78 84 76 80 41 56 38 40 43 49 30
 86 70 35 64 59 74 53 88 94 90 92 29 66 37 39 57 45 71 26 28 61 68 21 27
 24 33 18 22 20 25 17 16 14 13 23 15 11 12  9 10 19  7  5  6  8  4  3  2
  1  0]
Release Clause [ 293   82  294 ... 1032   19  126]
```

In [18]:
```
data.dtypes
```

Out[18]:

Unnamed: 0	int64
ID	int64
Name	int64
Age	int64
Photo	object
Nationality	int64
Flag	object
Overall	int64
Potential	int64
Club	int64
Club Logo	object
Value	int64
Wage	int64
Special	int64
Preferred Foot	int64
International Reputation	float64
Weak Foot	float64
Skill Moves	float64
Work Rate	int64
Body Type	int64
Real Face	int64
Position	int64
Jersey Number	float64
Joined	int64
Contract Valid Until	int64
Height	int64
Weight	int64
LS	int64
ST	int64
RS	int64
LW	int64
LF	int64
CF	int64
RF	int64
RW	int64
LAM	int64
CAM	int64
RAM	int64
LM	int64
LCM	int64
CM	int64

```
RCM                 int64
RM                  int64
LWB                 int64
LDM                 int64
CDM                 int64
RDM                 int64
RWB                 int64
LB                  int64
LCB                 int64
CB                  int64
RCB                 int64
RB                  int64
Crossing          float64
Finishing         float64
HeadingAccuracy   float64
ShortPassing      float64
Volleys           float64
Dribbling         float64
Curve             float64
FKAccuracy        float64
LongPassing       float64
BallControl       float64
Acceleration      float64
SprintSpeed       float64
Agility           float64
Reactions         float64
Balance           float64
ShotPower         float64
Jumping           float64
Stamina           float64
Strength          float64
LongShots         float64
Aggression        float64
Interceptions     float64
Positioning       float64
Vision            float64
Penalties         float64
Composure         float64
Marking           float64
StandingTackle    float64
SlidingTackle     float64
GKDiving          float64
```

```
GKHandling                float64
GKKicking                 float64
GKPositioning             float64
GKReflexes                float64
Release Clause              int64
dtype: object
```

In [19]:
```
encoding_of_cat
# можем выполнить декодирование
```

Out[19]:
```
{'Name': LabelEncoder(),
 'Nationality': LabelEncoder(),
 'Club': LabelEncoder(),
 'Value': LabelEncoder(),
 'Wage': LabelEncoder(),
 'Preferred Foot': LabelEncoder(),
 'Work Rate': LabelEncoder(),
 'Body Type': LabelEncoder(),
 'Real Face': LabelEncoder(),
 'Position': LabelEncoder(),
 'Joined': LabelEncoder(),
 'Contract Valid Until': LabelEncoder(),
 'Height': LabelEncoder(),
 'Weight': LabelEncoder(),
 'LS': LabelEncoder(),
 'ST': LabelEncoder(),
 'RS': LabelEncoder(),
 'LW': LabelEncoder(),
 'LF': LabelEncoder(),
 'CF': LabelEncoder(),
 'RF': LabelEncoder(),
 'RW': LabelEncoder(),
 'LAM': LabelEncoder(),
 'CAM': LabelEncoder(),
 'RAM': LabelEncoder(),
 'LM': LabelEncoder(),
 'LCM': LabelEncoder(),
 'CM': LabelEncoder(),
 'RCM': LabelEncoder(),
 'RM': LabelEncoder(),
 'LWB': LabelEncoder(),
 'LDM': LabelEncoder(),
 'CDM': LabelEncoder(),
 'RDM': LabelEncoder(),
 'RWB': LabelEncoder(),
 'LB': LabelEncoder(),
 'LCB': LabelEncoder(),
 'CB': LabelEncoder(),
 'RCB': LabelEncoder(),
 'RB': LabelEncoder(),
 'Release Clause': LabelEncoder()}
```

In [20]:
```
encoding_of_cat['Preferred Foot'].inverse_transform([0, 1])
```

Out[20]:
```
array(['Left', 'Right'], dtype=object)
```

In [21]:
```
enc_value = encoding_of_cat['Name'].transform(['L. Messi'])[0]
l_messi_data = data[data['Name'] == enc_value]
l_messi_data
```

Out[21]:

	Unnamed: 0	ID	Name	Age	Photo	Nationality	Flag	Overall	Potential	Club
0	0	158023	9632	31	https://cdn.sofifa.org/players/4/19/158023.png	6	https://cdn.sofifa.org/flags/52.png	94	94	212

1 rows × 88 columns

In [22]:
```
encoding_of_cat['Nationality'].inverse_transform([l_messi_data['Nationality'][0]])
```

Out[22]:
```
array(['Argentina'], dtype=object)
```

In [23]:
```
encoding_of_cat['Club'].inverse_transform([l_messi_data['Club'][0]])
```

Out[23]:
```
array(['FC Barcelona'], dtype=object)
```

In [24]:
```
encoding_of_cat['Preferred Foot'].inverse_transform([l_messi_data['Preferred Foot'][0]])
```

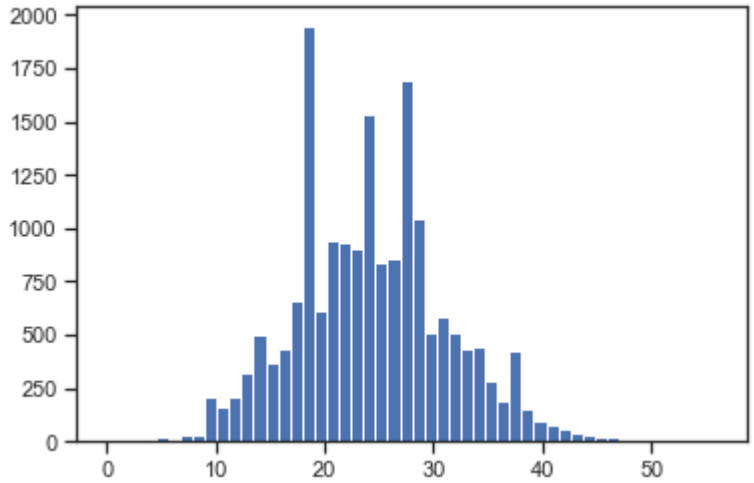
Out[24]:
```
array(['Left'], dtype=object)
```

In [25]:
```
from sklearn.preprocessing import MinMaxScaler, StandardScaler, Normalizer
```

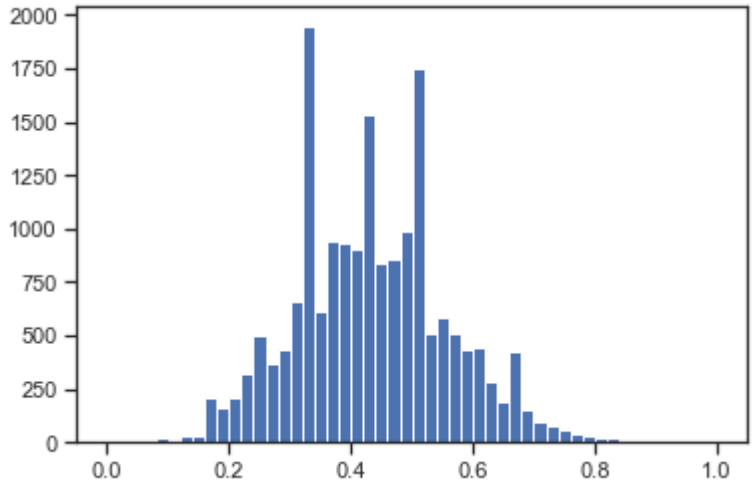
In [26]:
```
sc1 = MinMaxScaler()
sc1_data = sc1.fit_transform(data[['Weight']])
```

```
/Users/artyom.andreev/Study/.venv/lib/python3.7/site-packages/sklearn/preprocessing/data.py:334: DataConvers
ionWarning: Data with input dtype int64 were all converted to float64 by MinMaxScaler.
  return self.partial_fit(X, y)
```

In [28]:
```
plt.hist(data['Weight'], 50)
plt.show()
```



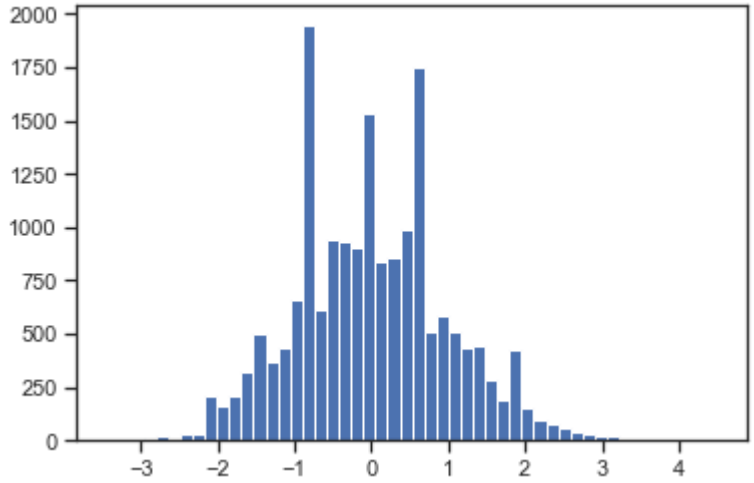
In [29]:
```
plt.hist(sc1_data, 50)
plt.show()
```



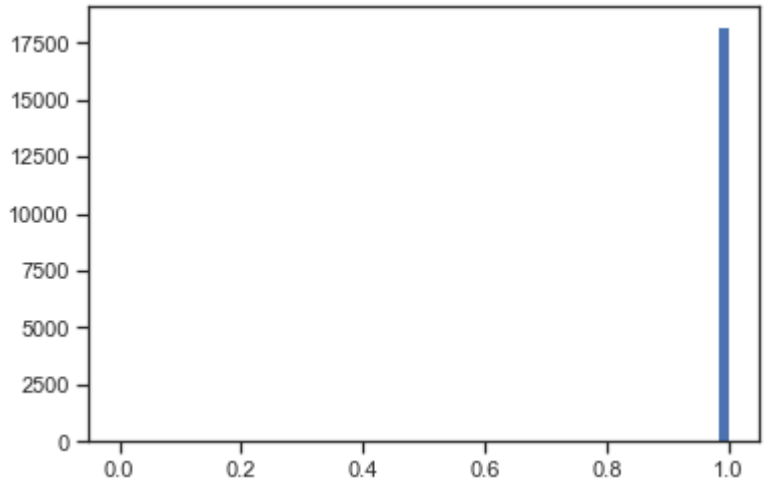
In [31]:
```
# на основе z-оценки
sc2 = StandardScaler()
sc2_data = sc2.fit_transform(data[['Weight']])
```

```
/Users/artyom.andreev/Study/.venv/lib/python3.7/site-packages/sklearn/preprocessing/data.py:645: DataConvers
ionWarning: Data with input dtype int64 were all converted to float64 by StandardScaler.
  return self.partial_fit(X, y)
/Users/artyom.andreev/Study/.venv/lib/python3.7/site-packages/sklearn/base.py:464: DataConversionWarning: Da
ta with input dtype int64 were all converted to float64 by StandardScaler.
  return self.fit(X, **fit_params).transform(X)
```

In [32]:
```
plt.hist(sc2_data, 50)
plt.show()
```



In [49]:
```
# нормализация
sc3 = Normalizer()
sc3_data = sc3.fit_transform(data[['Weight']])
plt.hist(sc3_data, 50)
plt.show()
```



In [ ]: