# Processamento de Linguagem Natural

Projeto Final - Chatbot com Rasa

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# **Classificador e Extrator**

Resultados



## Classificador

```
Done loading: atis.train.pkl
samples: 4978
vocab_size: 943
slot count: 129
intent count: 26
Done loading: atis.test.pkl
samples: 893
vocab_size: 943
slot count: 129
intent count: 26
```

```
INPUT_LENGTH = 48
EMBEDDING_SIZE = 100
UNITS = 128
DROPOUT = 0.2
### Training parameters
LOSS = "categorical_crossentropy"
OPTIMIZER = "adam"
BATCH_SIZE = 32
EPOCHS = 8
LABELS = 26
EMBEDDING_DIMS = len(dicts['token_ids'])+1
```

```
def create_model(type, embedding_dims, embedding_size, input_length, units, dropout, labels):
    model = Sequential()
    model.add(Embedding(embedding_dims, embedding_size, input_length=input_length))
    model.add(type(units, return_sequences=True)) #p/ mais de uma camada
    model.add(Dropout(dropout))
    model.add(type(units,return_sequences=False))
    model.add(Dropout(dropout))
    model.add(Dense(labels, activation='softmax'))
    return model
```





# **LSTM**

		L,			V														
0 -	0	0	0	1	0	0	0	0	0	0	0	0	0	0	0	0	0	0	2
п-	0	14	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0	0
2 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
m -	0	0	0	93	1	0	0	0	2	0	2	0	0	1	0	1	0	0	0
4 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
- 22	0	0	0	0	0	46	0	0	0	0	3	0	0	0	0	0	0	0	0
9 -	0	0	0	0	0	0	5	0	2	0	1	0	0	0	0	1	0	0	0
7	0	0	0	0	0	0	0	5	0	0	0	0	0	0	0	0	0	0	0
ω -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
6 -	0	1	0	0	0	0	1	5	0	4	0	0	0	0	0	0	0	6	0
01 -	0	0	1	0	0	0	1	0	1	0	6e+	1	1	0	0	0	1	0	0
Π-	0	0	0	1	0	0	0	0	0	0	5	4	1	0	0	0	0	0	0
12	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
13	0	0	0	0	0	0	0	0	0	0	4	0	1	6	0	0	1	0	0
14	0	0	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0	0
15	0	0	0	0	0	0	0	0	0	0	0	0	0	0	2	46	0	0	0
16	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
17	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0	11	0
- 18	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0
'	0	í	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18

					UFPE	DE PERR
100			precision	recall	f1-score	support
		0	0.00	0.00	0.00	3
		1	0.93	0.93	0.93	15
		2	0.00	0.00	0.00	0
-80		3	0.98	0.93	0.95	100
		4	0.00	0.00	0.00	0
		6	1.00	0.94	0.97	49
		8	0.71	0.56	0.63	9
		9	0.50	1.00	0.67	5
		11	0.00	0.00	0.00	0
60		13	1.00	0.24	0.38	17
		14	0.98	0.99	0.99	863
		15	0.80	0.36	0.50	11
		17	0.00	0.00	0.00	0
		19	0.75	0.50	0.60	12
40		20	0.60	1.00	0.75	3
		21	0.96	0.96	0.96	48
		23	0.00	0.00	0.00	0
		24	0.65	0.92	0.76	12
		25	0.00	0.00	0.00	0
20	accur	acy			0.95	1147
	macro	avg	0.52	0.49	0.48	1147
	weighted	avg	0.97	0.95	0.95	1147

# **RNN**



support

6 4 0

0

54 0

11

0

0 843

5

0

0

0

0 8 0

1147

1147

1147

61

155

f1-score

0.00

0.11

0.71

0.44

0.00

0.00

0.00

0.97

0.20

0.00

0.00

0.00

0.84

0.00

0.40

0.87

0.22

0.88

	30																			- 100				
0 -	0	2	0	1	0	0	0	1	0	0	2	0	0	0	0	0	0	0	0	100			precision	recall
-	0	1	0	0	0	1	0	0	0	0	0	0	1	1	0	0	0	0	0			0	0.00	0.00
2	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			1	0.07	0.25
				V. Serie				·						ď	ŭ	Ĭ	Ĭ	Ŭ	Ĭ			2	0.00	0.00
m -	0	7	1	89	1	18	2	2	3	1	15	3	1	5	0	1	0	6	0	- 80		3	0.94	0.57
4 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			4	0.00	0.00
									_						_							6	0.48	0.41
ru -	U	1	0	1	0	22	3	0	2	0	23	0	0	1	0	0	1	U	0			8	0.00	0.00
9 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			9	0.60	0.55
_	0	1	0	0	0	0	0	6	0	1	0	0	0	1	0	0	0	2	0			11	0.00	0.00
888																				- 60		13	0.00	0.00
00 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			14	0.95	0.99
6 -	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			15	0.20	0.20
						-			•	•	2-1/		-	0	0	0	,	1				17	0.00	0.00
8 -	0	1	0	0	0	3	1	U	U	U	3e+0	21	2	U	U	U	1	2	U			19	0.00	0.00
11	0	0	0	0	0	1	1	0	0	0	0	1	0	0	0	1	0	0	1	- 40		20	0.00	0.00
12	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			21	0.96	0.75
-																						23	0.00	0.00
13	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			24	0.29	0.62
14	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			25	0.00	0.00
10	0	1	0	3	0	0	0	1	0	2	0	0	0	0	5	46	0	2	1	- 20				
15		-	·	,		•	U	1	·	-	٠	·				-10	v	-	-		accur			
16	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0		macro	200	0.24	0.23
17	0	1	0	1	0	1	0	0	0	0	0	0	0	0	0	0	0	5	0		weighted	avg	0.91	0.87
- 18	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0					
-		i	2	3	4	5	6	7			10			13	14	15	16			- 0				ci

# **GRU**



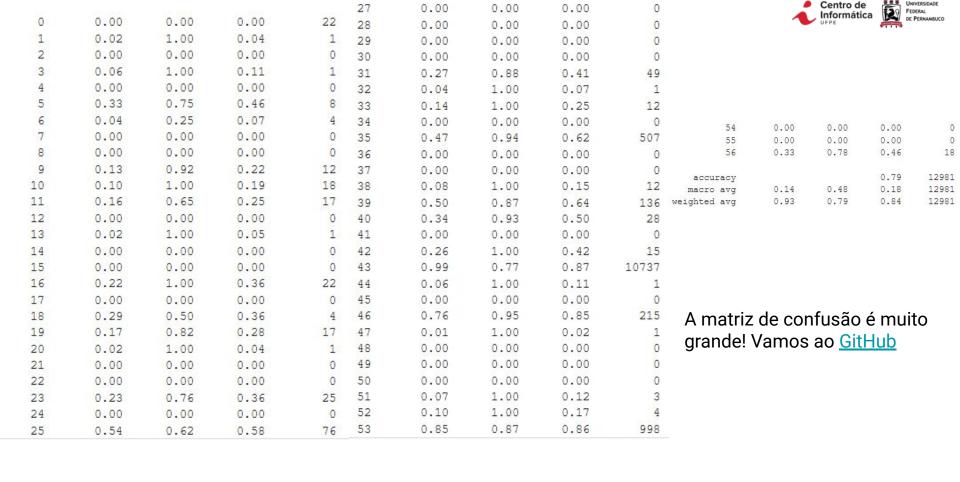
032550			0	1	^	^		^	^	^	^	^	^	41			0	^	-	- 100				0.0000000000000000000000000000000000000		
307.0	MARK.									U	U	U	v	1	U	U	U	U	2				precision	recall	f1-score	support
П	0	14	0	0	0	0	0	0	1	0	0	0	0	2	0	0	1	0	0			220	20.22		1 12	102
01.	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0			0	0.00	0.00	0.00	4
																						1	0.93	0.78	0.85	18
m -	0	0	0	94	1	0	0	0	0	0	2	0	0	0	0	0	0	0	0	- 80		2	0.00	0.00	0.00	0
	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	00		3	0.99	0.97	0.98	97
2.7																						4	0.00	0.00	0.00	0
ru -	0	0	0	0	0	44	0	0	0	0	0	0	0	0	0	0	0	0	0			6	0.96	1.00	0.98	44
9 -	0	0	0	0	0	0	6	0	0	0	0	0	0	0	0	1	0	0	0			8	0.86	0.86	0.86	7
	0.0-0																					9	1.00	0.71	0.83	14
7	0	1	0	0	0	0	0	10	0	0	0	0	0	0	0	0	0	3	0	- 60		11	0.60	1.00	0.75	3
ω -	0	0	0	0	0	0	0	0	3	0	0	0	0	0	0	0	0	0	0			13	1.00	0.80	0.89	5
				_		_				10	_						_	_	_			14	0.99	0.99	0.99	869
σ.	U	U	U	0	0	U	U	U	0	4	U	U	U	0	1	0	U	U	U			15	0.80	0.36	0.50	11
10	0	0	0	0	0	1	1	0	1	08	6e+0	21	0	0	0	0	1	0	0			17	0.75	1.00	0.86	3
-1	0	0	1	0	0	0	0	0	0	0	6	4	0	0	0	0	0	0	0	- 40		19	0.62	0.83	0.71	6
300																				17170		20	0.80	1.00	0.89	4
12	0	0	0	0	0	0	0	0	0	0	0	0	3	0	0	0	0	0	0			21	0.98	1.00	0.99	47
В.	0	0	0	0	0	1	0	0	0	0	0	0	0	5	0	0	0	0	0			23	0.00	0.00	0.00	0
100																	_					24	0.82	0.93	0.87	15
14	0	U	U	0	0	0	0	0	U	0	0	0	0	0	4	0	U	0	U	100		25	0.00	0.00	0.00	0
15	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	47	0	0	0	- 20						
91	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0		accu	racy			0.97	1147
		Ť			-	- T	Ĭ		Ĭ	Ŭ	Ŭ	Ŭ	Ť	Š		Ĭ		Ť			macro	avg	0.64	0.64	0.63	1147
17	0	0	0	0	0	0	0	0	0	0	0	0	1	0	0	0	0	14	0		weighted	avg	0.98	0.97	0.97	1147
. 20	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0	0							
				-7			_													- 0				_		_



#### **Extrator**

```
Done loading: atis.train.pkl
                                            BATCH SIZE = 64
     samples: 4978
                                            EMBEDDING DIM = 128
  vocab size: 943
                                            UNITS = 128
  slot count: 129
                                            EPOCHS= 4
intent count: 26
                                           LABEL = len(i21)+1
Done loading: atis.test.pkl
                                           VOCABULARY = len(dicts['token ids'])+1
     samples: 893
                                            INPUT LENGTH = 42
  vocab size: 943
                                            INPUT DIM = len(x text)+1
  slot count: 129
                                            OUTPUT DIM=64
intent count: 26
```

```
model = Sequential()
model.add(Embedding(input_dim=INPUT_DIM, output_dim=UNITS, input_length=INPUT_LENGTH))
model.add(Bidirectional(GRU(units=UNITS, return_sequences=True, dropout=0.3, recurrent_dropout=0.3), merge_mode = 'concat'))
model.add(GRU(units=UNITS, return_sequences=True, dropout=0.5, recurrent_dropout=0.5))
model.add(TimeDistributed(Dense(LABEL, activation="relu")))
model.summary()
model.compile(loss='categorical crossentropy', optimizer='adam', metrics=['accuracy'])
```



recall

precision

f1-score

support

26

0.17

0.93

0.29

15



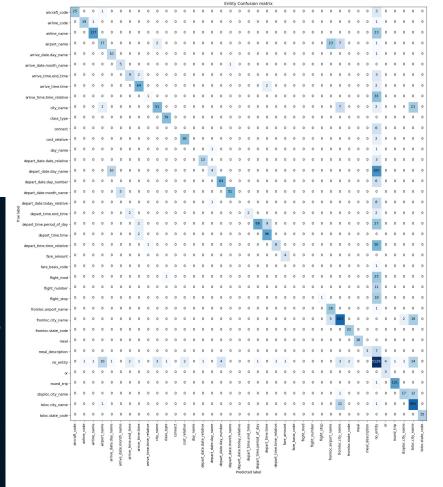
# **Chatbot com o Rasa**



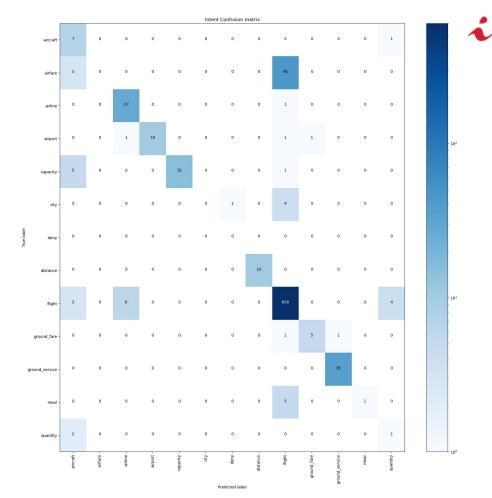


## **Extrator**

```
"micro avg": {
  "precision": 0.927731673582296,
 "recall": 0.822501532801962,
 "f1-score": 0.8719532011699709,
  "support": 3262
"macro avg": {
 "precision": 0.7111569637312417,
 "recall": 0.618799018681978,
 "f1-score": 0.6118535524885375,
 "support": 3262
"weighted avg": {
 "precision": 0.897342279375854,
 "recall": 0.822501532801962,
  "f1-score": 0.8266082646461117,
  "support": 3262
```



# Classificador









#### **Stories**

Temos apenas dois stories, pois o form permite captar vários slots em uma única chamada.

```
- story: principalVoo
  steps:
- intent: flight
- action: flight_form
- active_loop: flight_form
- active_loop: null
- action: action_api_test
- checkpoint: check_flow_finished
```

```
story: finish flowsteps:checkpoint: check_flow_finishedintent: goodbyeaction: utter_goodbye
```

```
forms:
    flight_form:
        required_slots:
        depart_date.day_number:
            - entity: depart_date.day_number
            | type: from_entity
            depart_date.month_name:
            - entity: depart_date.month_name
            | type: from_entity
            fromloc.city_name:
            - entity: fromloc.city_name
            | type: from_entity
            toloc.city_name:
            - entity: toloc.city_name
            | type: from_entity
```

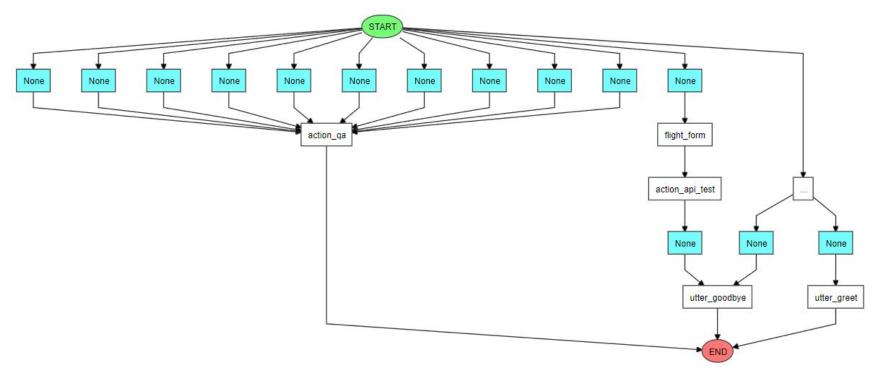


### Rules

```
rule: Say goodbye anytime the user says goodbye steps:intent: goodbyeaction: utter_goodbye
```

```
rule: Greet everytime the user greets steps:intent: greetaction: utter_greet
```





Dialog-flow



# Q&A

```
story: mealComAirline
                             - story: mealComCidades
                               steps:
steps:
                               - intent: meal
- intent: meal
                                 entities:
  entities:
                                 - fromloc.city name: "
  - airline name: ''
                                 - toloc.city name: ''
  - meal: ''
                                 - meal: ''
- action: action_qa
                                - action: action ga
story: airline
steps:
- intent: airline
                             steps:
 entities:
                             - intent: ground fare
```

- fromloc.city name: "

- toloc.city name: ''

- fromloc.city name: '

- toloc.city name: ''

- action: action qa

story: aircraft

entities:

- intent: aircraft

- action: action ga

steps:

```
story: ground fareComCity
  entities:
 - city name: ''
- action: action qa
```

```
story: quantity
steps:
- intent: quantity
  entities:
  - fromloc.city name: '
  - toloc.city name: ''
- action: action ga
```

```
story: capacityComAirlineCode
steps:
- intent: capacity
 entities:
  - airline code: ''
- action: action_qa
```

```
story: ground serviceComFromLoc
steps:
- intent: ground service
  entities:
  - fromloc.city name: ''
- action: action ga
```

```
story: capacityComAirline
steps:
- intent: capacity
 entities:
 - airline name: ''
 action: action qa
```

```
story: ground fareComAirportName
steps:
- intent: ground fare
  entities:
  - fromloc.airport name: ''
- action: action ga
```

```
steps:
- intent: airport
  entities:
  - city name: ''
 action: action qa
```

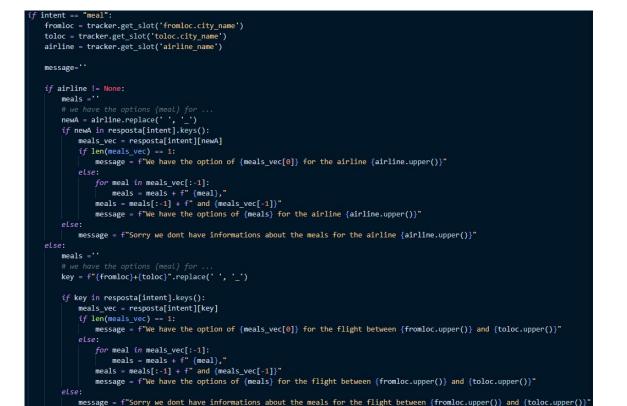
- story: airport

```
story: distance
steps:
- intent: distance
  entities:
  - fromloc.city name: '
  - toloc.city name: ''
- action: action ga
```

```
story: ground serviceComCity
                                    steps:
steps:
                                       entities:
- intent: ground service
  entities:
  - city name: ''
                                     - action: action qa
 action: action qa
```

```
story: restriction
- intent: restriction
  - fromloc.city name: ''
  - toloc.citv name: ''
```

#### **Stories**





action\_qa

dispatcher.utter\_message(text=message)

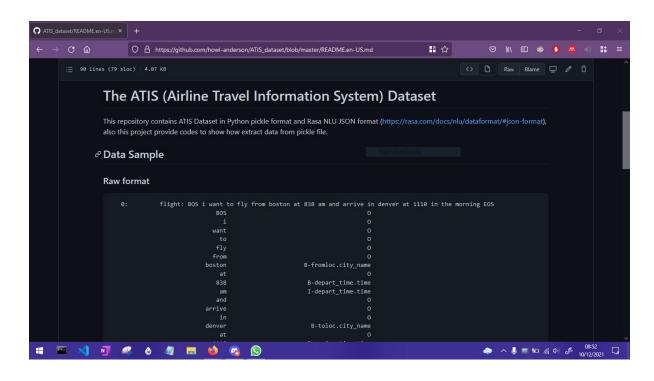


# **Busca**





## **Dados usados**



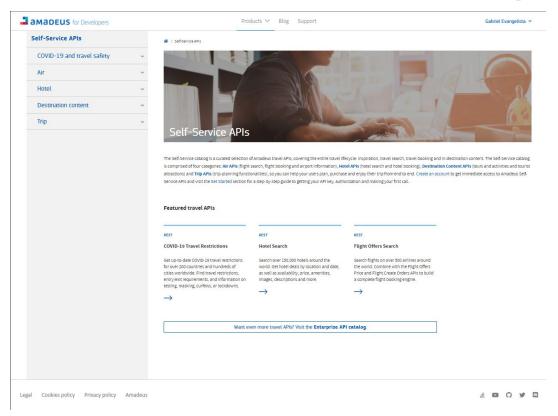
https://github.com/howl-anderson/ATIS\_dataset





#### **Ferramenta**

Amadeus API



https://developers.amadeus.com/





# Integração

- Obtenção de Token
- Chamada para conversão de nome para IATA code
- Chamada final para obtenção dos voos entre as cidades e na data especificados

```
headers = {
    'Content-Type': 'application/x-www-form-urlencoded',
data = {
     'grant_type': 'client_credentials',
    'client id': apiKey,
    'client secret': apiSecret
response = requests.post('https://test.api.amadeus.com/v1/security/oauth2/token', headers=headers, data=data)
dicti = json.loads(response.text)
headers = {
    'Authorization': 'Bearer ' + dicti['access token'],
params = (
   ('subType', 'CITY'),
   ('keyword', str(tracker.get_slot('fromloc.city_name'))),
response2 = requests.get('https://test.api.amadeus.com/v1/reference-data/locations', headers=headers, params=params)
fromCity = json.loads(response2.text)['data'][0]['iataCode']
params = (
    ('originLocationCode', str(fromCity)),
    ('destinationLocationCode', str(toCity)),
    ('departureDate', str(dataVoo.strftime('%Y-%m-%d'))),
    ('adults', 1),
response2 = requests.get('https://test.api.amadeus.com/v2/shopping/flight-offers', headers=headers, params=params)
dicti2 = json.loads(response2.text)
```