

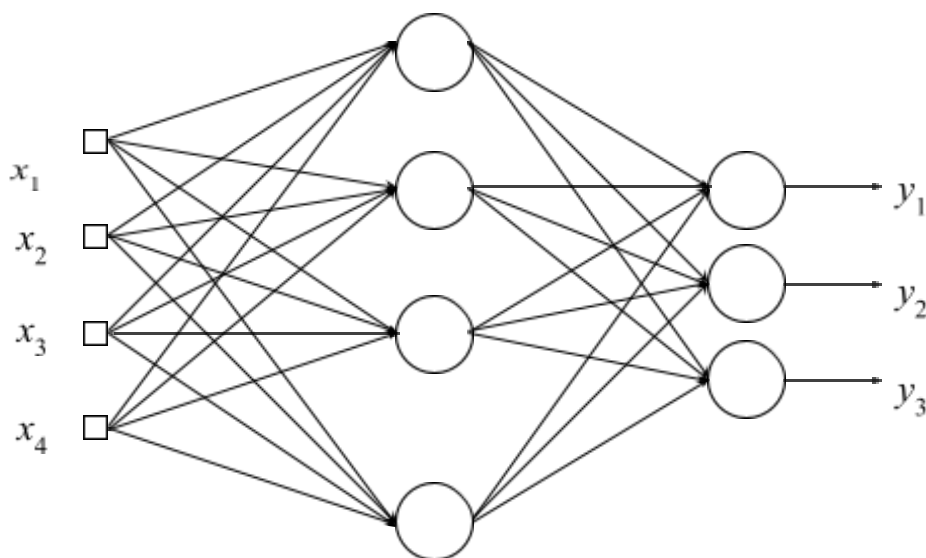
EXERCÍCIO MLPClassifier - BEBIDAS:

Implementar a solução e responder as questões e forma de relatório. Utilizar Python no Google Colab para a resolução. Deve-se apresentar o código em anexo.

Descrição do Problema:

No processamento de bebidas, a aplicação de um determinado conservante é efetuada em função da combinação de 04 variáveis reais, definidas por x_1 (teor de água), x_2 (grau de acidez), x_3 (temperatura) e x_4 (tensão superficial). Sabe-se que existem apenas três tipos de conservantes que podem ser aplicados, os quais são categorizados por tipo A, B e C. A partir destas variáveis, realizam-se ensaios em laboratório para especificar que tipo de conservante deve ser aplicado em determinada bebida.

Por intermédio de 148 desses ensaios experimentais, a equipe de engenheiros e cientistas resolveu aplicar uma rede perceptron multicamadas como classificadora de padrões, a fim de que esta identifique qual conservante será aplicado em determinado lote de bebida. Por questões operacionais da própria linha de produção, utilizar-se-á aqui uma rede perceptron com três saídas, conforme apresentado na figura abaixo.



A padronização para a saída, representando o conservante a ser aplicado, ficou definida da seguinte forma:

Tipo de Conservante	y_1	y_2	y_3
Tipo A	1	0	0
Tipo B	0	1	0
Tipo C	0	0	1

Utilizando os dados de treinamento apresentados no Anexo, execute o treinamento de uma rede perceptron multicamadas (04 entradas, variação dos neurônios da camada oculta e 03 saídas) que possa classificar, em função apenas dos valores medidos de x_1 , x_2 , x_3 e x_4 (já normalizados), qual

o tipo de conservante que deverá ser aplicado em determinada bebida. Para tanto, faça as seguintes atividades:

1. Execute três treinamentos da rede perceptron multicamadas ilustrada na Figura 1, por meio do MLPClassifier do Sklearn Python variando o número de neurônios na camada oculta com 5, 10 e 15. Utilize a função de ativação logística para todos os neurônios, taxa de aprendizagem = 0.001, precisão (épsilon) $\epsilon = 10^{-6}$ e máximo de épocas igual a 5000. Os demais parâmetros podem considerar o default. Qual configuração apresentou o melhor desempenho? Para cada configuração de treinamento, apresente o gráfico de perda (loss).

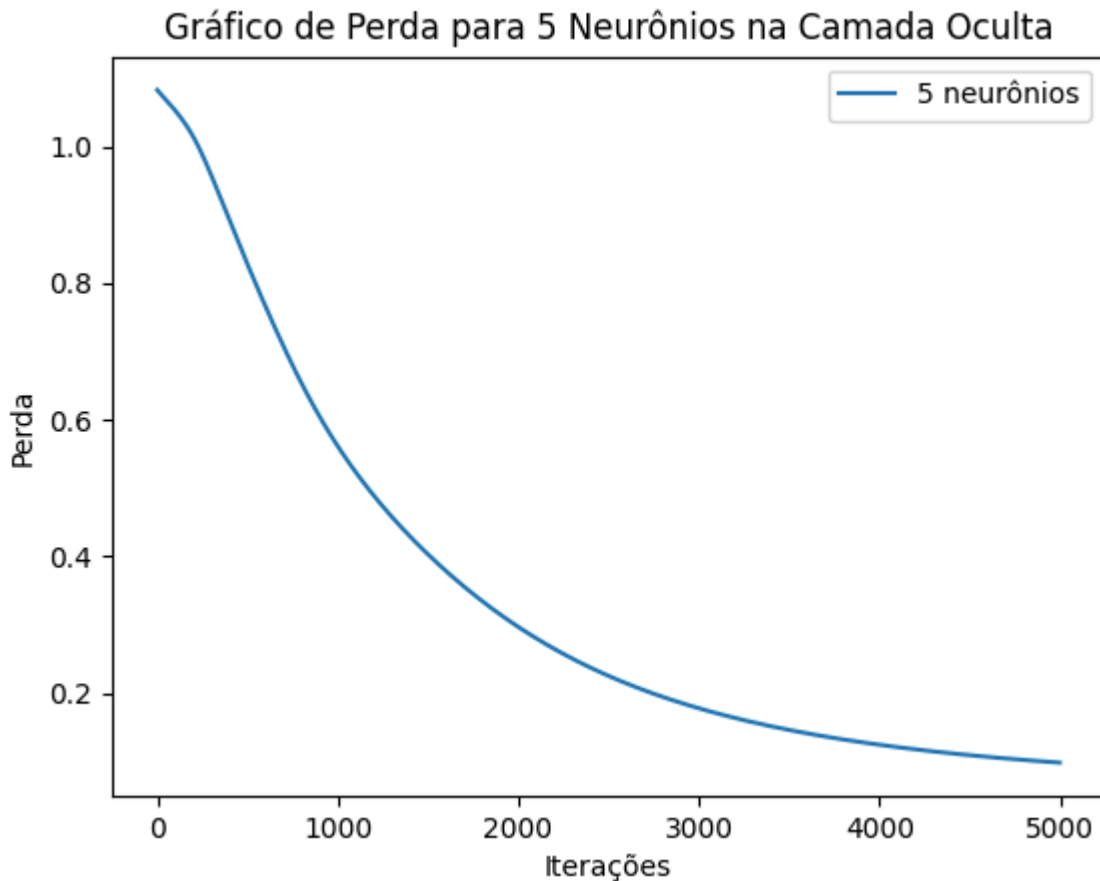


Gráfico de Perda para 10 Neurônios na Camada Oculta

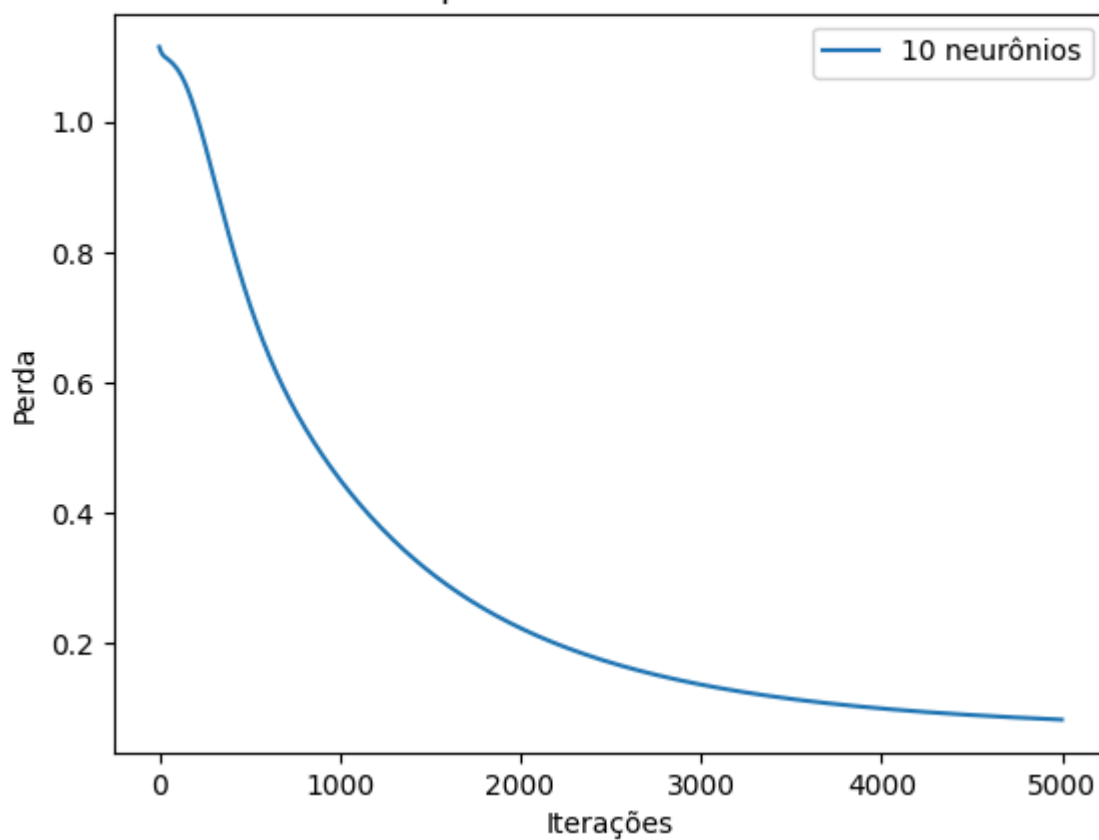
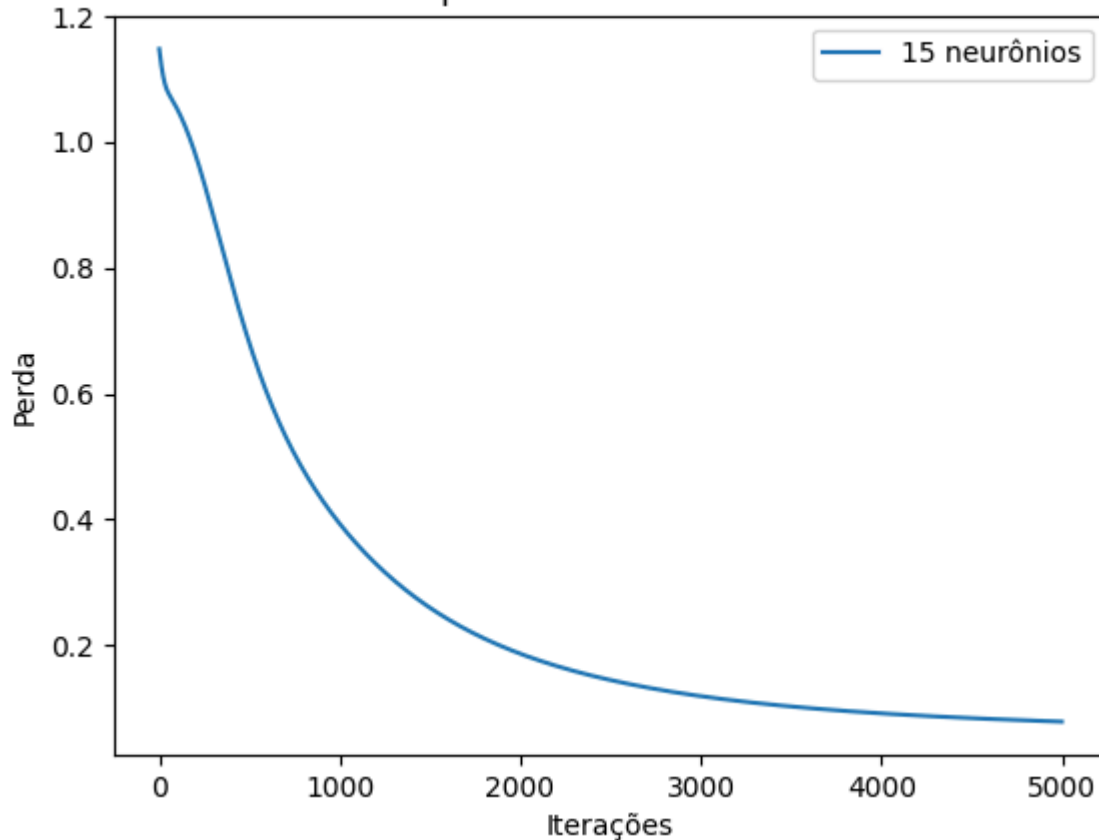


Gráfico de Perda para 15 Neurônios na Camada Oculta



2. Considerando a melhor configuração do Item 1 em função da perda, faça então a validação aplicando o conjunto de teste fornecido na tabela abaixo. Forneça a taxa de acerto/Acurácia (%) e MSE entre os valores desejados e os valores fornecidos pela rede em relação a todas as amostras de teste.

```
2024-06-03 13:05:58.531 | INFO | __main__:evaluate_model:31 -
MÉTRICAS DO TREINAMENTO
2024-06-03 13:05:58.532 | INFO | __main__:evaluate_model:33 - Melhor loss do treinamento: 0.09834194950756614
2024-06-03 13:05:58.532 | INFO | __main__:evaluate_model:34 - Último valor do loss para convergência: 0.09834194950756614
2024-06-03 13:05:58.534 | INFO | __main__:evaluate_model:35 - Mean Absolute Error (MAE): 0.044444444444444446
2024-06-03 13:05:58.536 | INFO | __main__:evaluate_model:36 - Mean Squared Error (MSE): 0.044444444444444446
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/metrics/_regression.py:492: FutureWarning: 'squared' is deprecated in version 1.4 and will be removed in 1.6. To calculate
warnings.warn(
2024-06-03 13:05:58.537 | INFO | __main__:evaluate_model:37 - Root Mean Squared Error (RMSE): 0.21081851067789195
2024-06-03 13:05:58.539 | INFO | __main__:evaluate_model:38 - Mean Absolute Percentage Error (MAPE): 0.018518518518517
2024-06-03 13:05:58.542 | INFO | __main__:evaluate_model:39 - R2: 0.9305555555555556
2024-06-03 13:05:58.543 | INFO | __main__:evaluate_model:10 -
MÉTRICAS DA CLASSIFICAÇÃO
2024-06-03 13:05:58.546 | INFO | __main__:evaluate_model:11 - Acurácia das amostras na classificação não apresentadas no treinamento: 0.9555555555555556
2024-06-03 13:05:58.550 | INFO | __main__:evaluate_model:12 - Acurácia balanceada na classificação das amostras não apresentadas no treinamento: 0.9583333333333334
2024-06-03 13:05:58.554 | INFO | __main__:evaluate_model:13 - Matriz de confusão das amostras não apresentadas no treinamento:
[[13  0  0]
 [ 1 15  0]
 [ 0  1 15]]
2024-06-03 13:05:58.564 | INFO | __main__:evaluate_model:16 - Relatório de classificação das amostras não apresentadas no treinamento:
2024-06-03 13:05:58.564 | INFO | __main__:evaluate_model:17 -
precision    recall  f1-score   support

   tipoA      0.93      1.00      0.96        13
   tipoB      0.94      0.94      0.94        16
...
accuracy            0.96
macro avg           0.96
weighted avg        0.96
```

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2024-06-03 13:05:58.743 | INFO | __main__:evaluate_model:31 -
MÉTRICAS DO TREINAMENTO
2024-06-03 13:05:58.744 | INFO | __main__:evaluate_model:33 - Melhor loss do treinamento: 0.0830825821055602
2024-06-03 13:05:58.744 | INFO | __main__:evaluate_model:34 - Último valor do loss para convergência: 0.0830825821055602
2024-06-03 13:05:58.746 | INFO | __main__:evaluate_model:35 - Mean Absolute Error (MAE): 0.044444444444444446
2024-06-03 13:05:58.747 | INFO | __main__:evaluate_model:36 - Mean Squared Error (MSE): 0.044444444444444446
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/metrics/_regression.py:492: FutureWarning: 'squared' is deprecated in version 1.4 and will be removed in 1.6. To calculate
warnings.warn(
2024-06-03 13:05:58.748 | INFO | __main__:evaluate_model:37 - Root Mean Squared Error (RMSE): 0.21081851067789195
2024-06-03 13:05:58.749 | INFO | __main__:evaluate_model:38 - Mean Absolute Percentage Error (MAPE): 0.018518518518517
2024-06-03 13:05:58.750 | INFO | __main__:evaluate_model:39 - R2: 0.9305555555555556
2024-06-03 13:05:58.751 | INFO | __main__:evaluate_model:10 -
MÉTRICAS DA CLASSIFICAÇÃO
2024-06-03 13:05:58.754 | INFO | __main__:evaluate_model:11 - Acurácia das amostras na classificação não apresentadas no treinamento: 0.9555555555555556
2024-06-03 13:05:58.757 | INFO | __main__:evaluate_model:12 - Acurácia balanceada na classificação das amostras não apresentadas no treinamento: 0.9583333333333334
2024-06-03 13:05:58.762 | INFO | __main__:evaluate_model:13 - Matriz de confusão das amostras não apresentadas no treinamento:
[[13  0  0]
 [ 1 15  0]
 [ 0  1 15]]
2024-06-03 13:05:58.772 | INFO | __main__:evaluate_model:16 - Relatório de classificação das amostras não apresentadas no treinamento:
2024-06-03 13:05:58.773 | INFO | __main__:evaluate_model:17 -
precision    recall  f1-score   support

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   tipoB      0.94      0.94      0.94        16
...
accuracy            0.96
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MÉTRICAS DO TREINAMENTO
2024-06-03 13:05:58.744 | INFO | __main__:evaluate_model:33 - Melhor loss do treinamento: 0.0830825821055602
2024-06-03 13:05:58.744 | INFO | __main__:evaluate_model:34 - Último valor do loss para convergência: 0.0830825821055602
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2024-06-03 13:05:58.762 | INFO | __main__:evaluate_model:13 - Matriz de confusão das amostras não apresentadas no treinamento:
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 [ 1 15  0]
 [ 0  1 15]]
2024-06-03 13:05:58.772 | INFO | __main__:evaluate_model:16 - Relatório de classificação das amostras não apresentadas no treinamento:
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...
accuracy            0.96
macro avg           0.96
weighted avg        0.96
```

Output is truncated. View as a [scrollable element](#) or open in a [text editor](#). Adjust cell output [settings](#)...

Amostra	x_1	x_2	x_3	x_4	d_1	d_2	d_3
1	0.8622	0.7101	0.6236	0.7894	0	0	1
2	0.2741	0.1552	0.1333	0.1516	1	0	0
3	0.6772	0.8516	0.6543	0.7573	0	0	1
4	0.2178	0.5039	0.6415	0.5039	0	1	0
5	0.7260	0.7500	0.7007	0.4953	0	0	1
6	0.2473	0.2941	0.4248	0.3087	1	0	0
7	0.5682	0.5683	0.5054	0.4426	0	1	0
8	0.6566	0.6715	0.4952	0.3951	0	1	0
9	0.0705	0.4717	0.2921	0.2954	1	0	0
10	0.1187	0.2568	0.3140	0.3037	1	0	0
11	0.5673	0.7011	0.4083	0.5552	0	1	0
12	0.3164	0.2251	0.3526	0.2560	1	0	0
13	0.7884	0.9568	0.6825	0.6398	0	0	1
14	0.9633	0.7850	0.6777	0.6059	0	0	1
15	0.7739	0.8505	0.7934	0.6626	0	0	1
16	0.4219	0.4136	0.1408	0.0940	1	0	0
17	0.6616	0.4365	0.6597	0.8129	0	0	1
18	0.7325	0.4761	0.3888	0.5683	0	1	0

Taxa de Acerto/Acurácia (%):

MSE:

ANEXO

Amostr a	x_1	x_2	x_3	x_4	d_1	d_2	d_3	Amostra	x_1	x_2	x_3	x_4	d_1	d_2	d_3
1	0.3841	0.2021	0.0000	0.243 8	1	0	0	71	0.3460	0.2722	0.1866	0.5049	1	0	0
2	0.1765	0.1613	0.3401	0.084 3	1	0	0	72	0.2241	0.2046	0.3575	0.2891	1	0	0
3	0.3170	0.5786	0.3387	0.419 2	0	1	0	73	0.1412	0.2264	0.4025	0.2661	1	0	0
4	0.2467	0.0337	0.2699	0.345 4	1	0	0	74	0.5782	0.6418	0.7212	0.6396	0	0	1
5	0.6102	0.8192	0.4679	0.476 2	0	1	0	75	0.9153	0.6571	0.8229	0.6689	0	0	1
6	0.7030	0.7784	0.7482	0.656 2	0	0	1	76	0.6014	0.7664	0.6385	0.5513	0	0	1
7	0.4767	0.4348	0.4852	0.364 0	0	1	0	77	0.7328	0.8708	0.8812	0.7060	0	0	1
8	0.7589	0.8256	0.6514	0.614 3	0	0	1	78	0.4270	0.6352	0.6811	0.3884	0	1	0
9	0.1579	0.3641	0.2551	0.291 9	1	0	0	79	0.6189	0.1652	0.4016	0.3042	1	0	0
10	0.5561	0.5602	0.5605	0.210 5	0	1	0	80	0.2143	0.3868	0.1926	0.0000	1	0	0
11	0.3267	0.2974	0.0343	0.146 6	1	0	0	81	0.5696	0.7238	0.7199	0.6677	0	0	1
12	0.2303	0.0942	0.3889	0.171 3	1	0	0	82	0.8656	0.6700	0.6570	0.6065	0	0	1
13	0.2953	0.2963	0.2600	0.303 9	1	0	0	83	0.9002	0.6858	0.7409	0.7047	0	0	1
14	0.5797	0.4789	0.5780	0.304 8	0	1	0	84	0.4167	0.5255	0.5506	0.4093	0	1	0
15	0.5860	0.5250	0.4792	0.402 1	0	1	0	85	0.8325	0.4804	0.7990	0.7471	0	0	1
16	0.7045	0.6933	0.6449	0.662 3	0	0	1	86	0.4124	0.1191	0.4720	0.3184	1	0	0
17	0.9134	0.9412	0.6078	0.593 4	0	0	1	87	1.0000	1.0000	0.7924	0.7074	0	0	1
18	0.2333	0.4943	0.2525	0.256 7	1	0	0	88	0.5685	0.6924	0.6180	0.5792	0	1	0
19	0.2676	0.4172	0.2775	0.272 1	1	0	0	89	0.6505	0.4864	0.2972	0.4599	0	1	0
20	0.4850	0.5506	0.5269	0.603 6	0	1	0	90	0.8124	0.7690	0.9720	1.0000	0	0	1
21	0.2434	0.2567	0.2312	0.262 4	1	0	0	91	0.9013	0.7160	1.0000	0.8046	0	0	1
22	0.1250	0.3023	0.1826	0.316 8	1	0	0	92	0.8872	0.7556	0.9307	0.6791	0	0	1
23	0.5598	0.4253	0.4258	0.319 2	0	1	0	93	0.3708	0.2139	0.2136	0.4295	1	0	0
24	0.5738	0.7674	0.6154	0.444 7	0	0	1	94	0.5159	0.4349	0.3715	0.4086	0	1	0
25	0.5692	0.8368	0.5832	0.458 5	0	0	1	95	0.6768	0.6304	0.8044	0.4885	0	0	1
26	0.4655	0.7682	0.3221	0.294 0	0	1	0	96	0.1664	0.2404	0.2000	0.3425	1	0	0
27	0.5568	0.7592	0.6293	0.545 3	0	1	0	97	0.2495	0.2807	0.4679	0.2200	1	0	0
28	0.8842	0.7509	0.5723	0.581 4	0	0	1	98	0.2487	0.2348	0.0913	0.1281	1	0	0
29	0.7959	0.9243	0.7339	0.733 4	0	0	1	99	0.5748	0.8552	0.5973	0.7317	0	0	1
30	0.7124	0.7128	0.6065	0.666 8	0	0	1	100	0.3858	0.7585	0.3239	0.3565	0	1	0
31	0.6749	0.8767	0.6543	0.746 1	0	0	1	101	0.3329	0.4946	0.5614	0.3152	0	1	0
32	0.3674	0.4359	0.4230	0.296 5	1	0	0	102	0.3891	0.4805	0.7598	0.4231	0	1	0
33	0.3473	0.0754	0.2183	0.190 5	1	0	0	103	0.2888	0.4888	0.1930	0.0177	1	0	0
34	0.6931	0.5188	0.5386	0.579 4	0	1	0	104	0.3827	0.4900	0.2272	0.3599	0	1	0
35	0.6439	0.4959	0.4322	0.458 2	0	1	0	105	0.6047	0.4224	0.6274	0.5809	0	1	0
36	0.5627	0.4893	0.6831	0.512 0	0	1	0	106	0.9840	0.7031	0.6469	0.4701	0	0	1
37	0.5182	0.7553	0.6368	0.453 8	0	1	0	107	0.6554	0.6785	0.9279	0.7723	0	0	1

38	0.6046	0.7479	0.6542	0.437 5	0	1	0	108	0.0466	0.3388	0.0840	0.0762	1	0	0
39	0.6328	0.6786	0.7751	0.618 3	0	0	1	109	0.6154	0.8196	0.6339	0.7729	0	0	1
40	0.3429	0.4694	0.2855	0.297 7	1	0	0	110	0.8452	0.8897	0.8383	0.6961	0	0	1
41	0.6371	0.5069	0.5316	0.452 0	0	1	0	111	0.6927	0.7870	0.7689	0.7213	0	0	1
42	0.6388	0.6970	0.6407	0.767 7	0	0	1	112	0.4032	0.6188	0.4930	0.5380	0	1	0
43	0.3529	0.5504	0.3706	0.482 8	0	1	0	113	0.4006	0.3094	0.3868	0.0811	1	0	0
44	0.4302	0.3237	0.6397	0.431 9	0	1	0	114	0.7416	0.7138	0.6823	0.6067	0	0	1
45	0.7078	0.9604	0.7470	0.639 9	0	0	1	115	0.7404	0.6764	0.8293	0.4694	0	0	1
46	0.7350	0.8170	0.7227	0.627 9	0	0	1	116	0.7736	0.7097	0.6826	0.8142	0	0	1
47	0.7011	0.2946	0.6625	0.431 2	0	1	0	117	0.5823	0.9635	0.3706	0.5636	0	1	0
48	0.5961	0.3817	0.6363	0.366 3	0	1	0	118	0.2081	0.3738	0.3119	0.3552	1	0	0
49	0.0000	0.2563	0.2603	0.302 7	1	0	0	119	0.5616	0.8972	0.5186	0.6650	0	0	1
50	0.5996	0.5704	0.6965	0.654 8	0	0	1	120	0.6594	0.8907	0.6000	0.7157	0	0	1
51	0.4289	0.3709	0.3994	0.365 6	0	1	0	121	0.3979	0.3070	0.3637	0.1220	1	0	0
52	0.2093	0.3655	0.3334	0.180 2	1	0	0	122	0.2644	0.0000	0.3572	0.1931	1	0	0
53	0.2335	0.2856	0.3912	0.160 1	1	0	0	123	0.4816	0.4791	0.4213	0.5889	0	1	0
54	0.3266	0.7751	0.4356	0.344 8	0	1	0	124	0.0848	0.0749	0.4349	0.3328	1	0	0
55	0.2457	0.1203	0.1228	0.220 6	1	0	0	125	0.4608	0.6775	0.3533	0.3016	0	1	0
56	0.4656	0.4815	0.4211	0.486 2	0	1	0	126	0.4155	0.6589	0.5310	0.5404	0	1	0
57	0.7511	0.8868	0.5408	0.625 3	0	0	1	127	0.3934	0.6244	0.4817	0.4324	0	1	0
58	0.7825	0.9386	0.6510	0.699 6	0	0	1	128	0.5843	0.8517	0.8576	0.7133	0	0	1
59	0.3463	0.4118	0.2507	0.045 4	1	0	0	129	0.1995	0.3690	0.3537	0.3462	1	0	0
60	0.5172	0.1482	0.3172	0.232 3	1	0	0	130	0.3832	0.2321	0.0341	0.2450	1	0	0
61	0.6942	0.4516	0.5387	0.598 3	0	1	0								
62	0.7586	0.7017	0.7120	0.750 9	0	0	1								
63	0.6880	0.6004	0.6602	0.432 0	0	1	0								
64	0.4742	0.5079	0.4135	0.416 1	0	1	0								
65	0.4419	0.5761	0.4515	0.449 7	0	1	0								
66	0.3367	0.4333	0.2336	0.167 8	1	0	0								
67	0.4744	0.4604	0.1507	0.487 3	1	0	0								
68	0.7510	0.4350	0.5453	0.483 1	0	1	0								
69	0.4045	0.5636	0.2534	0.557 3	0	1	0								
70	0.1449	0.1539	0.2446	0.055 9	1	0	0								

```
!pip install scikit-learn seaborn pandas numpy matplotlib loguru
```

```
Looking in indexes: https://pypi.org/simple,
https://packagecloud.io/github/git-lfs/pypi/simple
Requirement already satisfied: scikit-learn in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (1.5.0)
Requirement already satisfied: seaborn in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (0.13.0)
Requirement already satisfied: pandas in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (2.1.4)
Requirement already satisfied: numpy in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (1.25.2)
Requirement already satisfied: matplotlib in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (3.8.2)
Collecting loguru
  Obtaining dependency information for loguru from
  https://files.pythonhosted.org/packages/03/0a/4f6fed21aa246c6b49b561ca
  55facacc2a44b87d65b8b92362a8e99ba202/loguru-0.7.2-py3-none-
  any.whl.metadata
  Downloading loguru-0.7.2-py3-none-any.whl.metadata (23 kB)
Requirement already satisfied: scipy>=1.6.0 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
scikit-learn) (1.11.4)
Requirement already satisfied: joblib>=1.2.0 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
scikit-learn) (1.4.2)
Requirement already satisfied: threadpoolctl>=3.1.0 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
scikit-learn) (3.5.0)
Requirement already satisfied: python-dateutil>=2.8.2 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
pandas) (2.8.2)
Requirement already satisfied: pytz>=2020.1 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
pandas) (2023.3.post1)
Requirement already satisfied: tzdata>=2022.1 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
pandas) (2023.3)
Requirement already satisfied: contourpy>=1.0.1 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (1.2.0)
Requirement already satisfied: cycler>=0.10 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (0.12.1)
Requirement already satisfied: fonttools>=4.22.0 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (4.46.0)
Requirement already satisfied: kiwisolver>=1.3.1 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (1.4.5)
```



```
Requirement already satisfied: packaging>=20.0 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (23.2)
Requirement already satisfied: pillow>=8 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (10.1.0)
Requirement already satisfied: pyparsing>=2.3.1 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
matplotlib) (3.1.1)
Requirement already satisfied: six>=1.5 in
/home/juannascimento/Modelos/env/lib/python3.10/site-packages (from
python-dateutil>=2.8.2->pandas) (1.16.0)
Downloading loguru-0.7.2-py3-none-any.whl (62 kB)
_____ 62.5/62.5 kB 2.8 MB/s eta
0:00:00
[notice] A new release of pip is available: 23.2.1 -> 24.0
[notice] To update, run: pip install --upgrade pip
```

► **Multi-layer Perceptron Classifier (MLPClassifier)** - MLP também pode ser usado para resolver problemas de classificação. Para este exemplo foi utilizado o conjunto de dados Iris com todas as classes possíveis, da plataforma "Kaggle" (<https://www.kaggle.com/datasets/uciml/iris>)

```
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import MinMaxScaler
import seaborn as sns
import matplotlib.pyplot as plt
import pandas as pd
```

► Carregamento e Organização Inicial do Dataset

```
train = pd.read_csv("bebidas.csv")
test = pd.read_csv("bebidasTestes.csv")
```

```
base = pd.concat([train, test])
```

```
base
```

	x1	x2	x3	x4	d1	d2	d3
0	0.3841	0.2021	0.0000	0.2438	1	0	0
1	0.1765	0.1613	0.3401	0.0843	1	0	0
2	0.3170	0.5786	0.3387	0.4192	0	1	0
3	0.2467	0.0337	0.2699	0.3454	1	0	0
4	0.6102	0.8192	0.4679	0.4762	0	1	0
..
13	0.9633	0.7850	0.6777	0.6059	0	0	1
14	0.7739	0.8505	0.7934	0.6626	0	0	1
15	0.4219	0.4136	0.1408	0.0940	1	0	0
16	0.6616	0.4365	0.6597	0.8129	0	0	1
17	0.7325	0.4761	0.3888	0.5683	0	1	0

```
[148 rows x 7 columns]

tipoA = base.query("d1 == 1 & d2 == 0 & d3 == 0").copy()
tipoB = base.query("d1 == 0 & d2 == 1 & d3 == 0").copy()
tipoC = base.query("d1 == 0 & d2 == 0 & d3 == 1").copy()

# Função para determinar o target
def determine_target(row):
    if row['d1'] == 1 and row['d2'] == 0 and row['d3'] == 0:
        return 1
    elif row['d1'] == 0 and row['d2'] == 1 and row['d3'] == 0:
        return 2
    elif row['d1'] == 0 and row['d2'] == 0 and row['d3'] == 1:
        return 3
    else:
        return 4

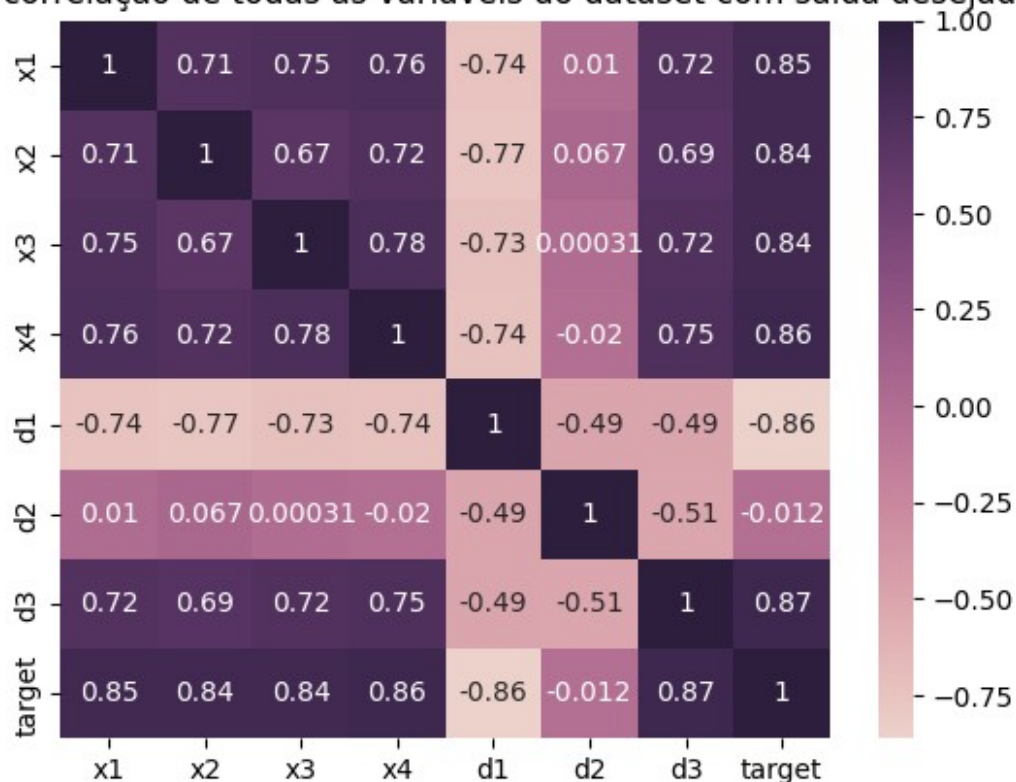
# Aplicando a função ao DataFrame
base['target'] = base.apply(determine_target, axis=1)

feature = base[['x1', 'x2', 'x3', 'x4']].copy()
target = base[['target']].copy()
```

► Mapa de correlação entre as variáveis do dataset

```
ax = sns.heatmap(base.corr(numeric_only=True), annot=True,
cmap=sns.cubehelix_palette(as_cmap=True))
ax.set_title('Mapa de correlação de todas as variáveis do dataset com
saída desejada')
ax=ax
```

Mapa de correlação de todas as variáveis do dataset com saída desejada



► Pré-Processamento dos Dados

```
Xcv = feature.copy()
scaler = MinMaxScaler().fit(feature)
X = scaler.transform(feature)

X_train, X_test, y_train, y_test = train_test_split(X, target,
test_size=0.30)
```

► Aplicação do MLPClassifier (

https://scikit-learn.org/stable/modules/generated/sklearn.neural_network.MLPClassifier.html)

Training With 5, 10 and 15 Layers

```
from loguru import logger
from sklearn.neural_network import MLPClassifier

def train_mlp(hidden_layer_size, X_train, y_train,
learning_rate_init=0.001, max_iter=5000, epsilon=1e-6):
    logger.info(f"Configurando o modelo com {hidden_layer_size}
neurônios, taxa de aprendizado {learning_rate_init}, máximo de
```

```
iterações {max_iter}, e tolerância {epsilon}).")
```

```
mlp = MLPClassifier(hidden_layer_sizes=(hidden_layer_size,),  
                    activation='logistic',  
                    learning_rate_init=learning_rate_init,  
                    max_iter=max_iter,  
                    tol=epsilon,  
                    random_state=42)
```

```
mlp.fit(X_train, y_train)  
logger.info(f"Modelo com {hidden_layer_size} neurônios treinado  
com sucesso.")
```

```
return mlp
```

```
mlp_5 = train_mlp(5, X_train, y_train)  
mlp_10 = train_mlp(10, X_train, y_train)  
mlp_15 = train_mlp(15, X_train, y_train)
```

```
2024-06-03 12:49:01.576 | INFO      | __main__:train_mlp:5 -  
Configurando o modelo com 5 neurônios, taxa de aprendizado 0.001,  
máximo de iterações 5000, e tolerância 1e-06.  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
neural_network/_multilayer_perceptron.py:1105: DataConversionWarning:  
A column-vector y was passed when a 1d array was expected. Please  
change the shape of y to (n_samples, ), for example using ravel().  
  y = column_or_1d(y, warn=True)  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
neural_network/_multilayer_perceptron.py:690: ConvergenceWarning:  
Stochastic Optimizer: Maximum iterations (5000) reached and the  
optimization hasn't converged yet.
```

```
warnings.warn(  
2024-06-03 12:49:02.474 | INFO      | __main__:train_mlp:17 - Modelo  
com 5 neurônios treinado com sucesso.
```

```
2024-06-03 12:49:02.475 | INFO      | __main__:train_mlp:5 -  
Configurando o modelo com 10 neurônios, taxa de aprendizado 0.001,  
máximo de iterações 5000, e tolerância 1e-06.  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
neural_network/_multilayer_perceptron.py:1105: DataConversionWarning:  
A column-vector y was passed when a 1d array was expected. Please  
change the shape of y to (n_samples, ), for example using ravel().  
  y = column_or_1d(y, warn=True)  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
neural_network/_multilayer_perceptron.py:690: ConvergenceWarning:  
Stochastic Optimizer: Maximum iterations (5000) reached and the  
optimization hasn't converged yet.
```

```
warnings.warn(  
2024-06-03 12:49:03.396 | INFO      | __main__:train_mlp:17 - Modelo  
com 10 neurônios treinado com sucesso.
```

```

2024-06-03 12:49:03.397 | INFO      | __main__:train_mlp:5 -
Configurando o modelo com 15 neurônios, taxa de aprendizado 0.001,
máximo de iterações 5000, e tolerância 1e-06.
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/
neural_network/_multilayer_perceptron.py:1105: DataConversionWarning:
A column-vector y was passed when a 1d array was expected. Please
change the shape of y to (n_samples, ), for example using ravel().
    y = column_or_1d(y, warn=True)
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/
neural_network/_multilayer_perceptron.py:690: ConvergenceWarning:
Stochastic Optimizer: Maximum iterations (5000) reached and the
optimization hasn't converged yet.
    warnings.warn(
2024-06-03 12:49:04.296 | INFO      | __main__:train_mlp:17 - Modelo
com 15 neurônios treinado com sucesso.

from loguru import logger
import matplotlib.pyplot as plt
from sklearn.metrics import accuracy_score

def evaluate_and_plot(model, X_test, y_test, hidden_layer_size):
    y_pred = model.predict(X_test)
    accuracy = accuracy_score(y_test, y_pred)
    logger.info(f'Configuração com {hidden_layer_size} neurônios -
Acurácia: {accuracy * 100:.2f}%')

    plt.plot(model.loss_curve_, label=f'{hidden_layer_size}
neurônios')
    plt.title(f'Gráfico de Perda para {hidden_layer_size} Neurônios na
Camada Oculta')
    plt.xlabel('Iterações')
    plt.ylabel('Perda')
    plt.legend()

    plot_filename = f'loss_curve_{hidden_layer_size}_neurons.png'
    plt.savefig(plot_filename)
    logger.info(f'Gráfico de perda salvo como {plot_filename}')

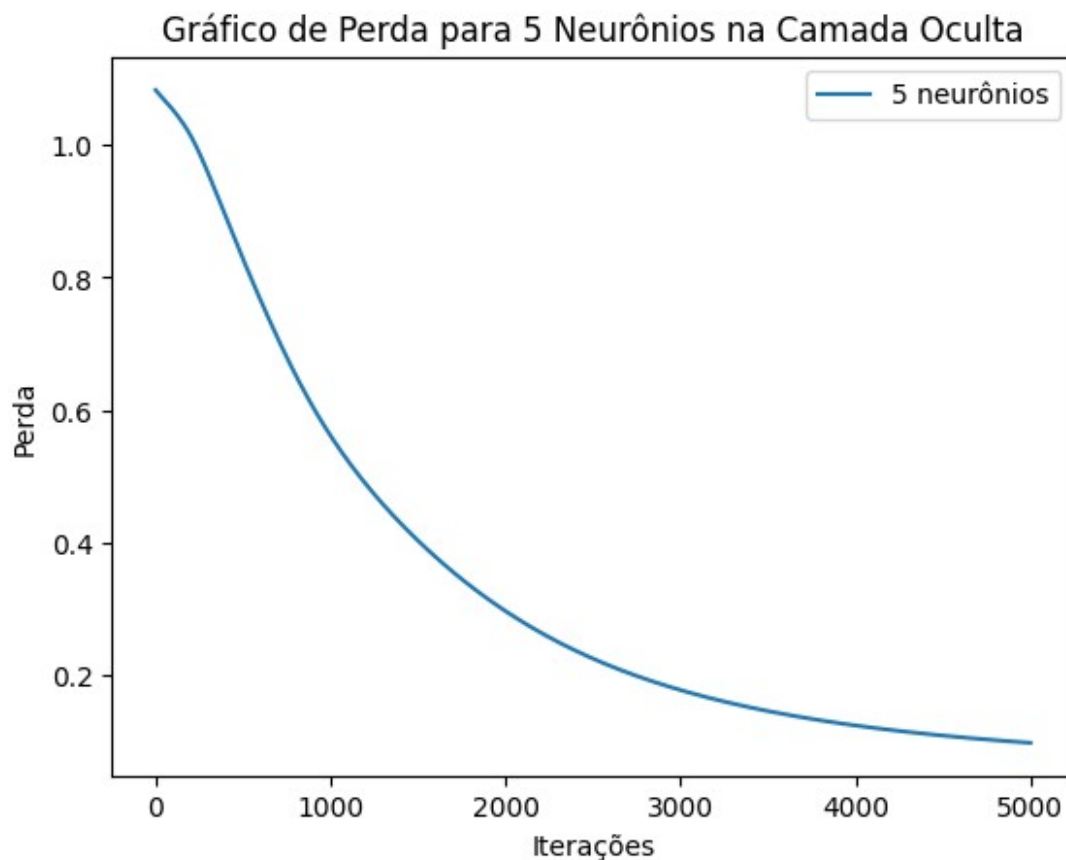
    plt.show()

# Exemplo de uso da função:
evaluate_and_plot(mlp_5, X_test, y_test, 5)
evaluate_and_plot(mlp_10, X_test, y_test, 10)
evaluate_and_plot(mlp_15, X_test, y_test, 15)

2024-06-03 13:03:40.097 | INFO      | __main__:evaluate_and_plot:8 -
Configuração com 5 neurônios - Acurácia: 95.56%

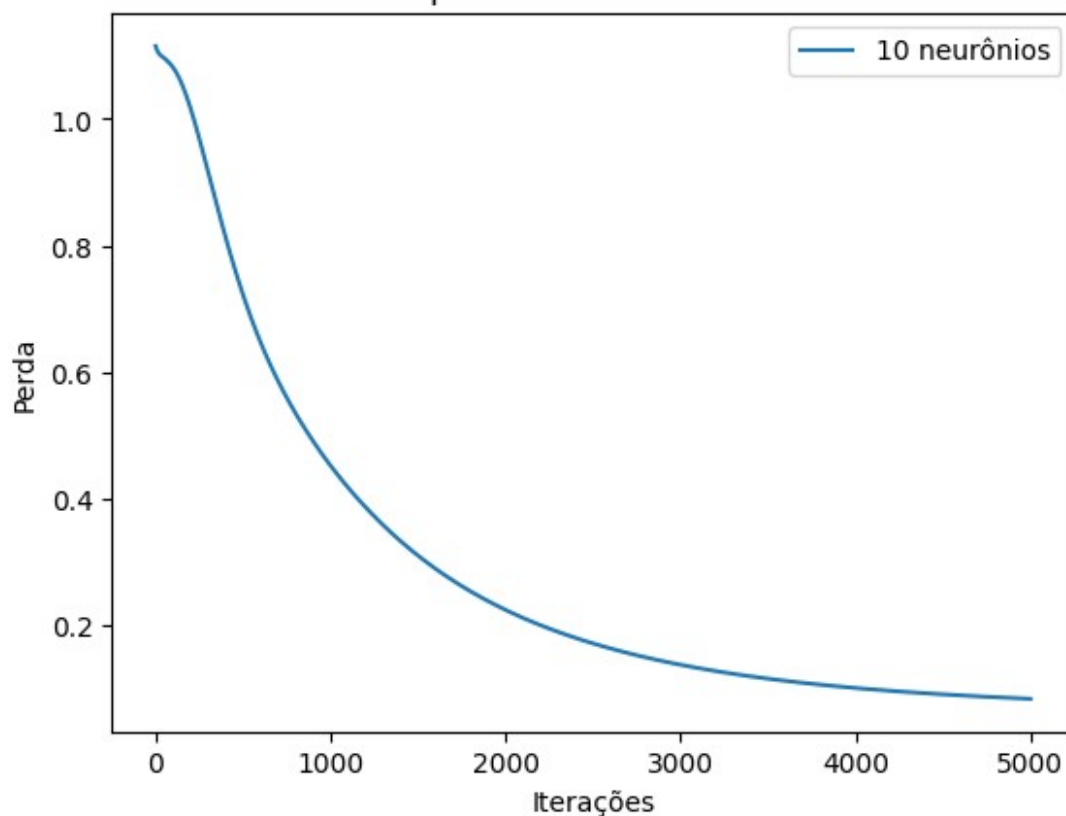
2024-06-03 13:03:40.185 | INFO      | __main__:evaluate_and_plot:18 -
Gráfico de perda salvo como loss_curve_5_neurons.png

```

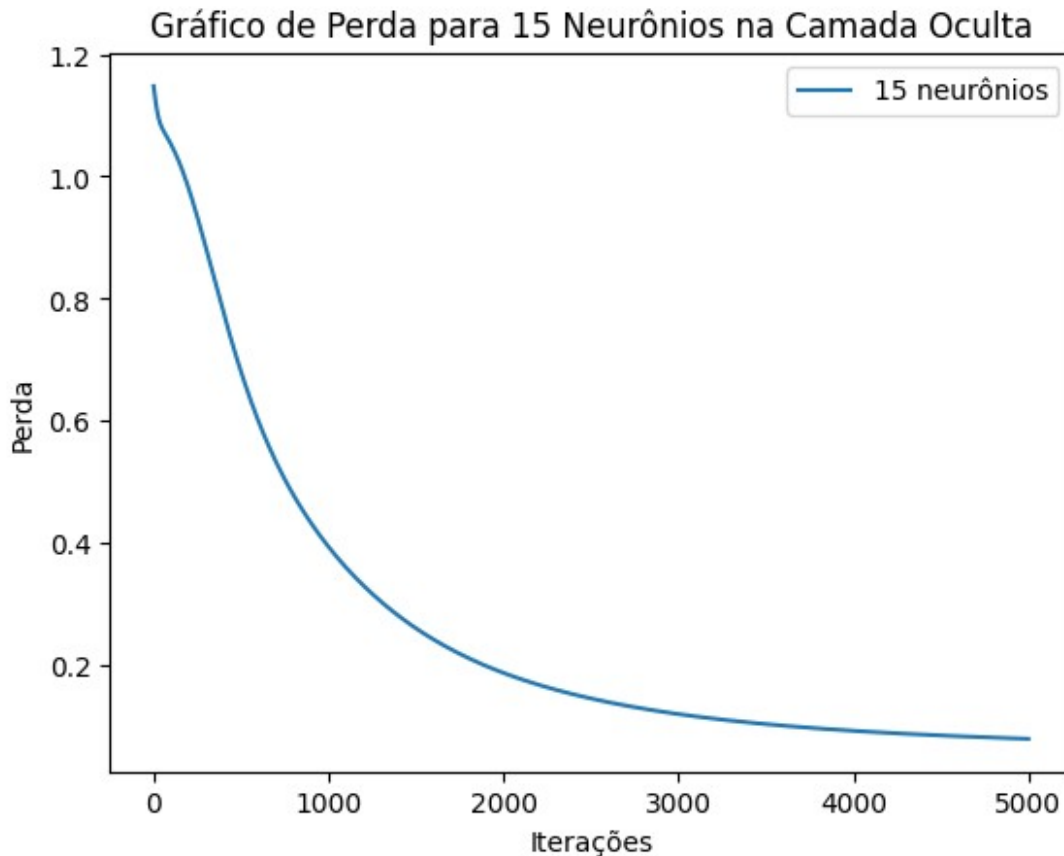


```
2024-06-03 13:03:40.274 | INFO      | __main__:evaluate_and_plot:8 -  
Configuração com 10 neurônios - Acurácia: 95.56%  
2024-06-03 13:03:40.350 | INFO      | __main__:evaluate_and_plot:18 -  
Gráfico de perda salvo como loss_curve_10_neurons.png
```

Gráfico de Perda para 10 Neurônios na Camada Oculta



```
2024-06-03 13:03:40.430 | INFO      | __main__:evaluate_and_plot:8 -  
Configuração com 15 neurônios - Acurácia: 95.56%  
2024-06-03 13:03:40.514 | INFO      | __main__:evaluate_and_plot:18 -  
Gráfico de perda salvo como loss_curve_15_neurons.png
```



► Avaliação do Modelo considerando um percentual fixo de amostras para treinamentos e outro para validação

```
from loguru import logger
import matplotlib.pyplot as plt
from sklearn.metrics import (accuracy_score, balanced_accuracy_score,
                             confusion_matrix,
                             classification_report,
                             ConfusionMatrixDisplay)
from sklearn import metrics

def evaluate_model(model, X_test, y_test):
    y_pred = model.predict(X_test)

    logger.info("\nMÉTRICAS DA CLASSIFICAÇÃO")
    logger.info(f"Acurácia das amostras na classificação não
    apresentadas no treinamento: {accuracy_score(y_test, y_pred)}")
    logger.info(f"Acurácia balanceada na classificação das amostras
    não apresentadas no treinamento: {balanced_accuracy_score(y_test,
    y_pred)}")
    logger.info(f"Matriz de confusão das amostras não apresentadas no
    treinamento:\n {confusion_matrix(y_test, y_pred)}")
```



```

    relatorio = classification_report(y_test, y_pred,
target_names=["tipoA", "tipoB", "tipoC"])
    logger.info("Relatório de classificação das amostras não
apresentadas no treinamento:")
    logger.info(f"\n{relatorio}")

    conf_matrix = confusion_matrix(y_test, y_pred)
    cm_display = ConfusionMatrixDisplay(confusion_matrix=conf_matrix,
display_labels=["tipoA", "tipoB", "tipoC"])
    cm_display.plot()
    plt.show()

    # Plotando o gráfico de erros no processo de treinamento
    plt.plot(model.loss_curve_)
    plt.title("Curva de Perda no Treinamento", fontsize=14)
    plt.xlabel('Épocas')
    plt.ylabel('Perda')
    plt.show()

    logger.info("\nMÉTRICAS DO TREINAMENTO")

    logger.info(f"Melhor loss do treinamento: {model.best_loss_}")
    logger.info(f"Último valor do loss para convergência:
{model.loss_}")
    logger.info(f"Mean Absolute Error (MAE):
{metrics.mean_absolute_error(y_test, y_pred)}")
    logger.info(f"Mean Squared Error (MSE):
{metrics.mean_squared_error(y_test, y_pred)}")
    logger.info(f"Root Mean Squared Error (RMSE):
{metrics.mean_squared_error(y_test, y_pred, squared=False)}")
    logger.info(f"Mean Absolute Percentage Error (MAPE):
{metrics.mean_absolute_percentage_error(y_test, y_pred)}")
    logger.info(f"R2: {metrics.r2_score(y_test, y_pred)}")

evaluate_model(mlp_5, X_test, y_test)
evaluate_model(mlp_10, X_test, y_test)
evaluate_model(mlp_15, X_test, y_test)

```

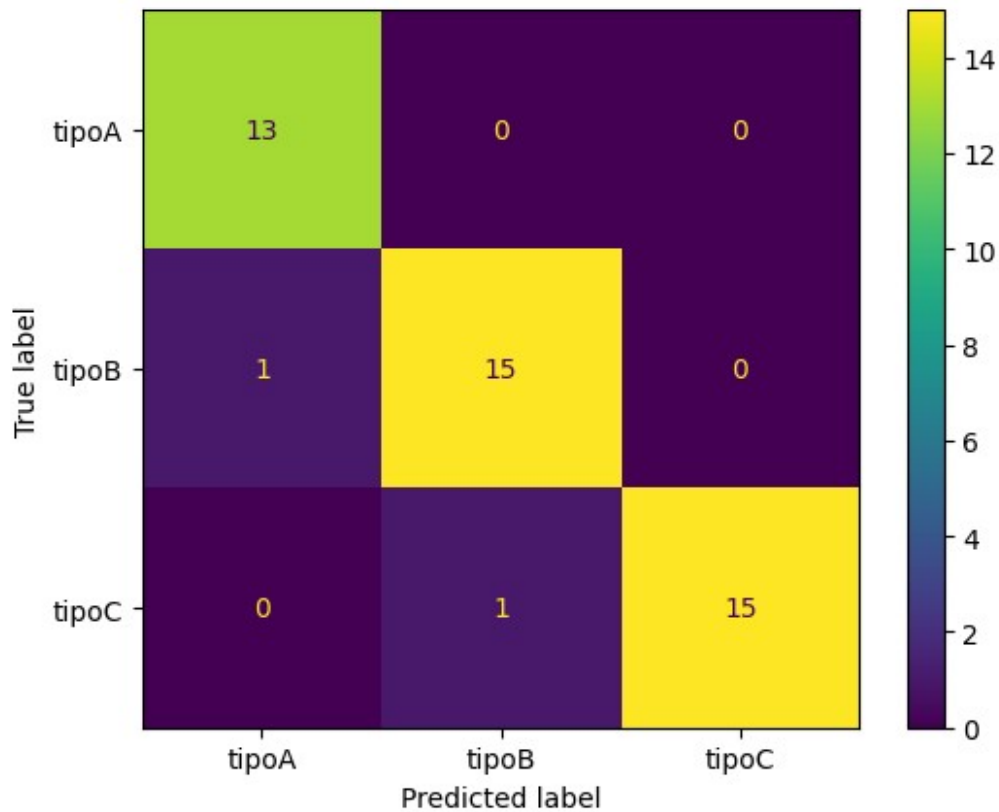
```

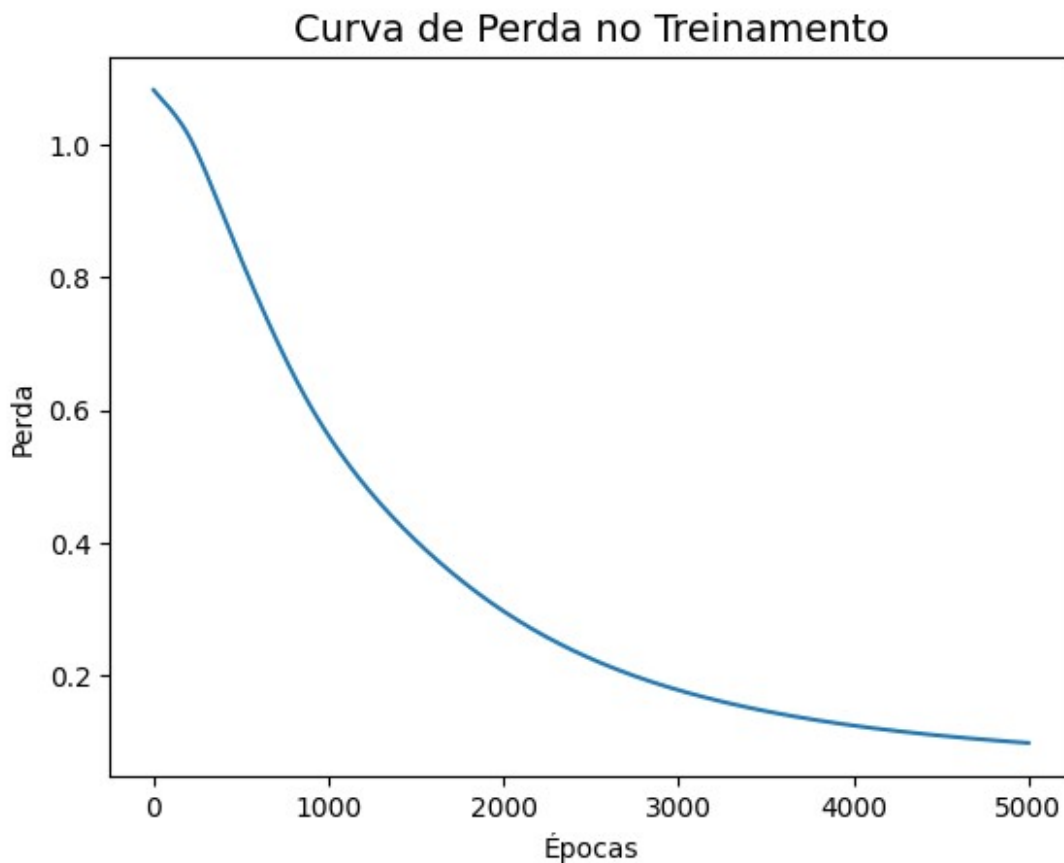
2024-06-03 13:05:58.314 | INFO      | __main__:evaluate_model:10 -
MÉTRICAS DA CLASSIFICAÇÃO
2024-06-03 13:05:58.319 | INFO      | __main__:evaluate_model:11 -
Acurácia das amostras na classificação não apresentadas no
treinamento: 0.9555555555555556
2024-06-03 13:05:58.326 | INFO      | __main__:evaluate_model:12 -
Acurácia balanceada na classificação das amostras não apresentadas no
treinamento: 0.9583333333333334
2024-06-03 13:05:58.331 | INFO      | __main__:evaluate_model:13 -
Matriz de confusão das amostras não apresentadas no treinamento:
[[13  0  0]

```

```
[ 1 15  0]
[ 0  1 15]]
2024-06-03 13:05:58.341 | INFO      | __main__:evaluate_model:16 -
Relatório de classificação das amostras não apresentadas no
treinamento:
2024-06-03 13:05:58.342 | INFO      | __main__:evaluate_model:17 -
```

	precision	recall	f1-score	support
tipoA	0.93	1.00	0.96	13
tipoB	0.94	0.94	0.94	16
tipoC	1.00	0.94	0.97	16
accuracy			0.96	45
macro avg	0.96	0.96	0.96	45
weighted avg	0.96	0.96	0.96	45



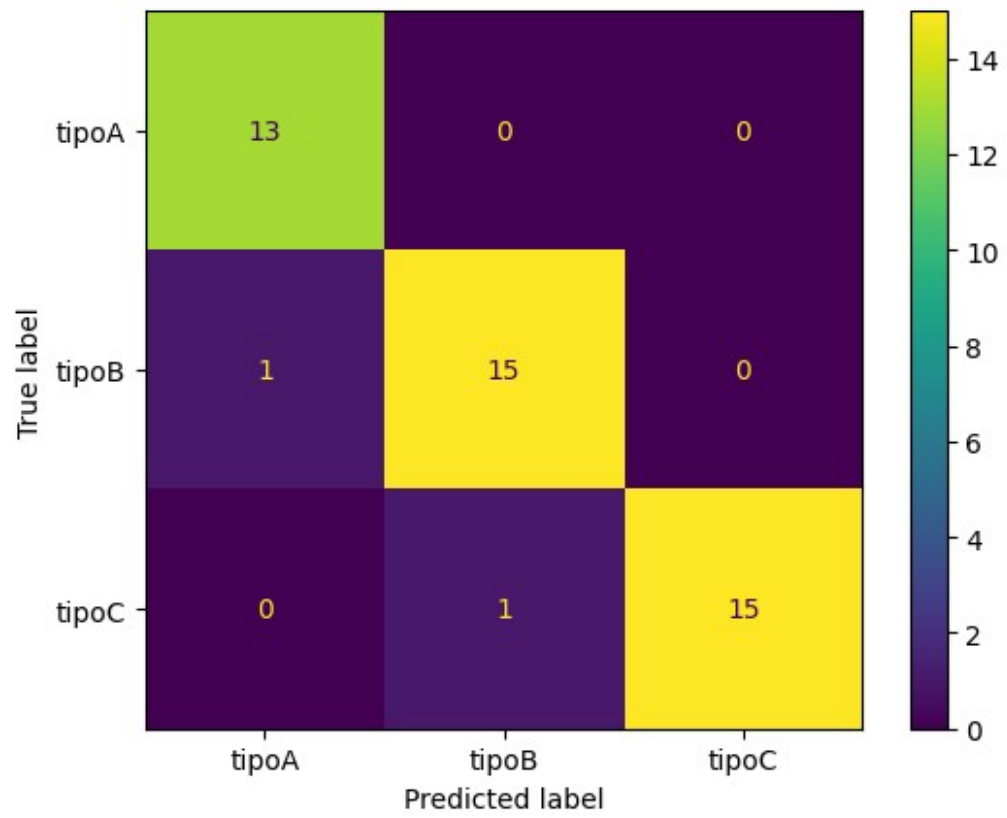


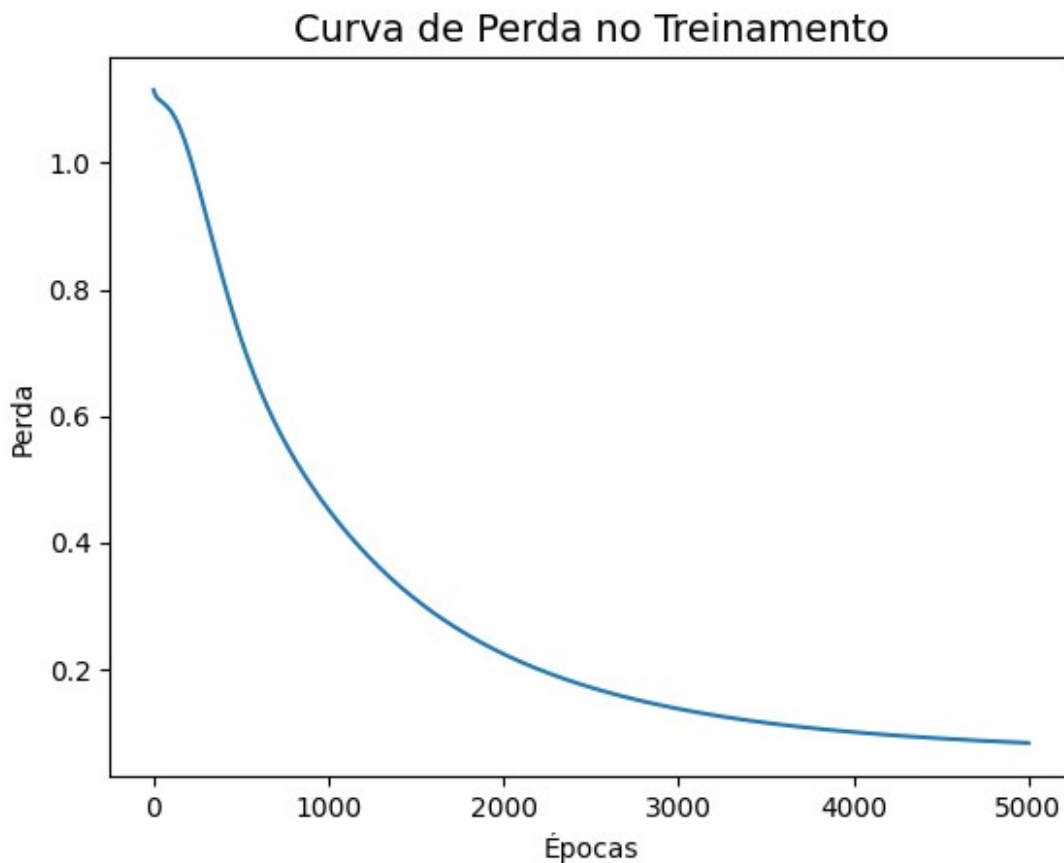
```
2024-06-03 13:05:58.531 | INFO      | __main__:evaluate_model:31 -  
MÉTRICAS DO TREINAMENTO  
2024-06-03 13:05:58.532 | INFO      | __main__:evaluate_model:33 -  
Melhor loss do treinamento: 0.09834194950756614  
2024-06-03 13:05:58.532 | INFO      | __main__:evaluate_model:34 -  
Último valor do loss para convergência: 0.09834194950756614  
2024-06-03 13:05:58.534 | INFO      | __main__:evaluate_model:35 - Mean  
Absolute Error (MAE): 0.044444444444444446  
2024-06-03 13:05:58.536 | INFO      | __main__:evaluate_model:36 - Mean  
Squared Error (MSE): 0.044444444444444446  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
metrics/_regression.py:492: FutureWarning: 'squared' is deprecated in  
version 1.4 and will be removed in 1.6. To calculate the root mean  
squared error, use the function'root_mean_squared_error'.  
  warnings.warn(  
2024-06-03 13:05:58.537 | INFO      | __main__:evaluate_model:37 - Root  
Mean Squared Error (RMSE): 0.21081851067789195  
2024-06-03 13:05:58.539 | INFO      | __main__:evaluate_model:38 - Mean  
Absolute Percentage Error (MAPE): 0.018518518518517  
2024-06-03 13:05:58.542 | INFO      | __main__:evaluate_model:39 - R2:  
0.9305555555555556  
2024-06-03 13:05:58.543 | INFO      | __main__:evaluate_model:10 -  
MÉTRICAS DA CLASSIFICAÇÃO
```

```
2024-06-03 13:05:58.546 | INFO      | __main__:evaluate_model:11 -
Acurácia das amostras na classificação não apresentadas no
treinamento: 0.9555555555555556
2024-06-03 13:05:58.550 | INFO      | __main__:evaluate_model:12 -
Acurácia balanceada na classificação das amostras não apresentadas no
treinamento: 0.9583333333333334
2024-06-03 13:05:58.554 | INFO      | __main__:evaluate_model:13 -
Matriz de confusão das amostras não apresentadas no treinamento:
[[13  0  0]
 [ 1 15  0]
 [ 0  1 15]]
2024-06-03 13:05:58.564 | INFO      | __main__:evaluate_model:16 -
Relatório de classificação das amostras não apresentadas no
treinamento:
2024-06-03 13:05:58.564 | INFO      | __main__:evaluate_model:17 -
precision    recall    f1-score   support

   tipoA      0.93      1.00      0.96         13
   tipoB      0.94      0.94      0.94         16
   tipoC      1.00      0.94      0.97         16

 accuracy      0.96
macro avg      0.96      0.96      0.96         45
weighted avg   0.96      0.96      0.96         45
```

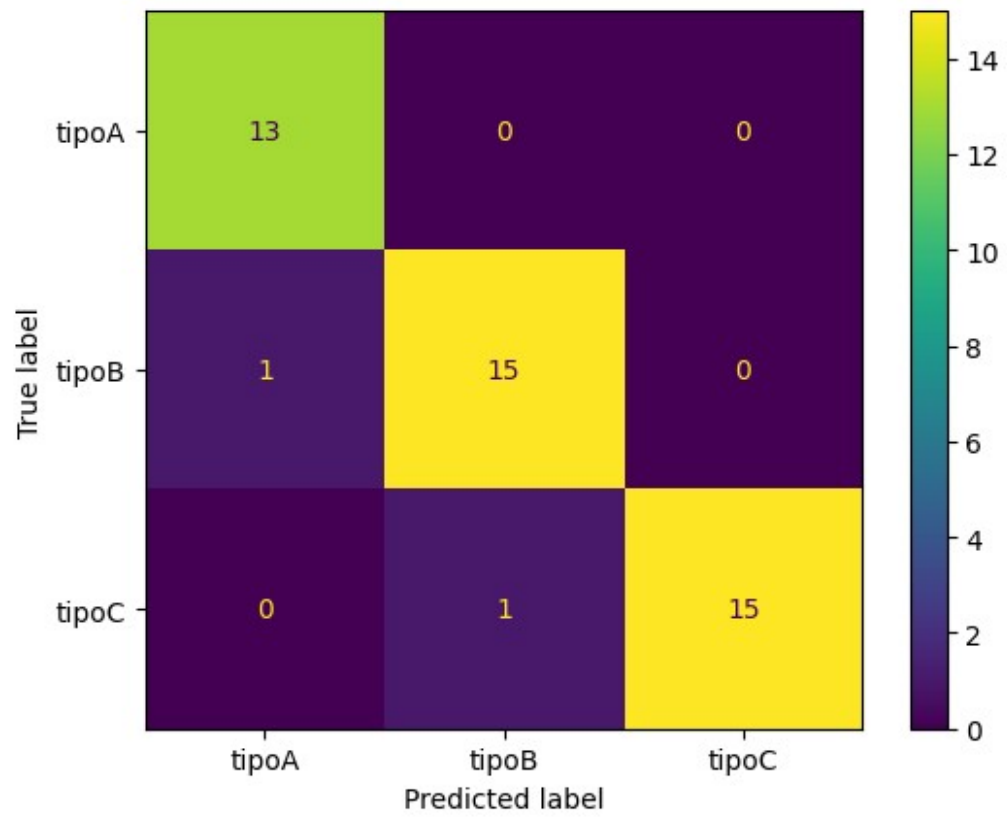


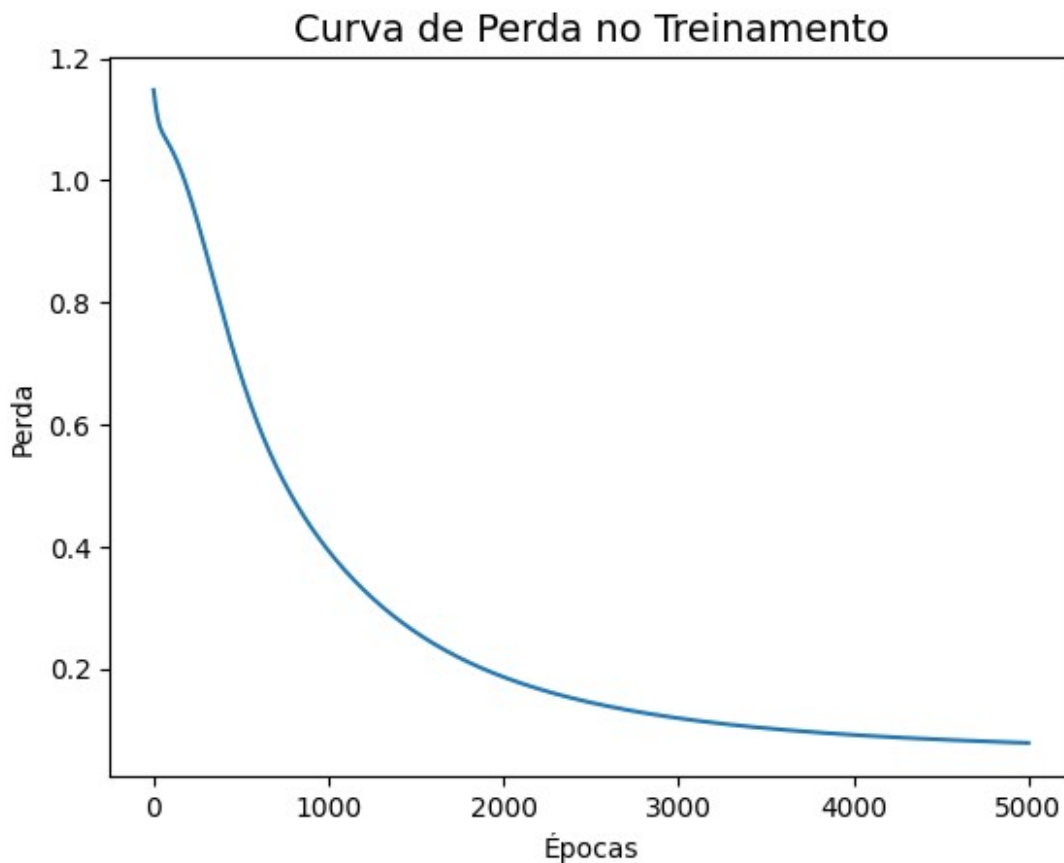


```
2024-06-03 13:05:58.743 | INFO      | __main__:evaluate_model:31 -  
MÉTRICAS DO TREINAMENTO  
2024-06-03 13:05:58.744 | INFO      | __main__:evaluate_model:33 -  
Melhor loss do treinamento: 0.0830825821055602  
2024-06-03 13:05:58.744 | INFO      | __main__:evaluate_model:34 -  
Último valor do loss para convergência: 0.0830825821055602  
2024-06-03 13:05:58.746 | INFO      | __main__:evaluate_model:35 - Mean  
Absolute Error (MAE): 0.044444444444444446  
2024-06-03 13:05:58.747 | INFO      | __main__:evaluate_model:36 - Mean  
Squared Error (MSE): 0.044444444444444446  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
metrics/_regression.py:492: FutureWarning: 'squared' is deprecated in  
version 1.4 and will be removed in 1.6. To calculate the root mean  
squared error, use the function'root_mean_squared_error'.  
  warnings.warn(  
2024-06-03 13:05:58.748 | INFO      | __main__:evaluate_model:37 - Root  
Mean Squared Error (RMSE): 0.21081851067789195  
2024-06-03 13:05:58.749 | INFO      | __main__:evaluate_model:38 - Mean  
Absolute Percentage Error (MAPE): 0.018518518518517  
2024-06-03 13:05:58.750 | INFO      | __main__:evaluate_model:39 - R2:  
0.9305555555555556  
2024-06-03 13:05:58.751 | INFO      | __main__:evaluate_model:10 -  
MÉTRICAS DA CLASSIFICAÇÃO
```

```
2024-06-03 13:05:58.754 | INFO      | __main__:evaluate_model:11 -
Acurácia das amostras na classificação não apresentadas no
treinamento: 0.9555555555555556
2024-06-03 13:05:58.757 | INFO      | __main__:evaluate_model:12 -
Acurácia balanceada na classificação das amostras não apresentadas no
treinamento: 0.9583333333333334
2024-06-03 13:05:58.762 | INFO      | __main__:evaluate_model:13 -
Matriz de confusão das amostras não apresentadas no treinamento:
[[13  0  0]
 [ 1 15  0]
 [ 0  1 15]]
2024-06-03 13:05:58.772 | INFO      | __main__:evaluate_model:16 -
Relatório de classificação das amostras não apresentadas no
treinamento:
2024-06-03 13:05:58.773 | INFO      | __main__:evaluate_model:17 -
precision      recall      f1-score      support
tipoA          0.93          1.00          0.96          13
tipoB          0.94          0.94          0.94          16
tipoC          1.00          0.94          0.97          16

accuracy
macro avg      0.96          0.96          0.96          45
weighted avg   0.96          0.96          0.96          45
```





```
2024-06-03 13:05:59.069 | INFO      | __main__:evaluate_model:31 -  
MÉTRICAS DO TREINAMENTO  
2024-06-03 13:05:59.070 | INFO      | __main__:evaluate_model:33 -  
Melhor loss do treinamento: 0.07854957189726301  
2024-06-03 13:05:59.070 | INFO      | __main__:evaluate_model:34 -  
Último valor do loss para convergência: 0.07854957189726301  
2024-06-03 13:05:59.072 | INFO      | __main__:evaluate_model:35 - Mean  
Absolute Error (MAE): 0.044444444444444446  
2024-06-03 13:05:59.073 | INFO      | __main__:evaluate_model:36 - Mean  
Squared Error (MSE): 0.044444444444444446  
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/  
metrics/_regression.py:492: FutureWarning: 'squared' is deprecated in  
version 1.4 and will be removed in 1.6. To calculate the root mean  
squared error, use the function'root_mean_squared_error'.  
  warnings.warn(  
2024-06-03 13:05:59.074 | INFO      | __main__:evaluate_model:37 - Root  
Mean Squared Error (RMSE): 0.21081851067789195  
2024-06-03 13:05:59.075 | INFO      | __main__:evaluate_model:38 - Mean  
Absolute Percentage Error (MAPE): 0.018518518518518517  
2024-06-03 13:05:59.077 | INFO      | __main__:evaluate_model:39 - R2:  
0.9305555555555555
```

► Avaliação do modelo considerando o método de validação cruzada utilizando o conjunto completo de dados e Pipeline para organizar a sequência de operações

```
from loguru import logger
from sklearn.pipeline import Pipeline
from sklearn.preprocessing import StandardScaler
from sklearn.neural_network import MLPClassifier
from sklearn.model_selection import cross_val_score
from numpy import mean, std

def evaluate_pipeline(X, y, hidden_layer_size=20, random_state=12,
max_iter=10000, epsilon=1e-10, learning_rate_init=0.0001, cv=5):
    logger.info("Criando uma sequência de operações com Pipeline.")

    # Criando uma sequência de operações com Pipeline
    MLP_pipeline = Pipeline(steps=[
        ("Padronização", StandardScaler()),
        ("MLP", MLPClassifier(hidden_layer_sizes=(hidden_layer_size,),
                               random_state=random_state,
                               max_iter=max_iter,
                               tol=epsilon,
                               learning_rate='constant',
                               learning_rate_init=learning_rate_init))
    ])

    logger.info("Testando o dataset completo utilizando a validação
cruzada.")
    scores_cross_val = cross_val_score(MLP_pipeline, X, y, cv=cv)

    logger.info("Resultados da validação cruzada do conjunto completo
de dados:")
    logger.info(scores_cross_val)
    logger.info(f"Média: {mean(scores_cross_val)}")
    logger.info(f"Desvio Padrão: {std(scores_cross_val)}")

evaluate_pipeline(Xcv, target)
```

2024-06-03 12:51:29.746 | INFO | __main__:evaluate_pipeline:9 -
Criando uma sequência de operações com Pipeline.
2024-06-03 12:51:29.747 | INFO | __main__:evaluate_pipeline:22 -
Testando o dataset completo utilizando a validação cruzada.
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/
neural_network/_multilayer_perceptron.py:1105: DataConversionWarning:
A column-vector y was passed when a 1d array was expected. Please
change the shape of y to (n_samples,), for example using ravel().
y = column_or_1d(y, warn=True)
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/
neural_network/_multilayer_perceptron.py:690: ConvergenceWarning:
Stochastic Optimizer: Maximum iterations (10000) reached and the

```

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neural_network/_multilayer_perceptron.py:690: ConvergenceWarning:
Stochastic Optimizer: Maximum iterations (10000) reached and the
optimization hasn't converged yet.
warnings.warn(
2024-06-03 12:51:39.266 | INFO      | __main__:evaluate_pipeline:25 -
Resultados da validação cruzada do conjunto completo de dados:
2024-06-03 12:51:39.267 | INFO      | __main__:evaluate_pipeline:26 -
[0.93333333 0.9          0.9          0.93103448 1.          ]
2024-06-03 12:51:39.268 | INFO      | __main__:evaluate_pipeline:27 -
Média: 0.9328735632183907

```

```
2024-06-03 12:51:39.268 | INFO      | __main__:evaluate_pipeline:28 -
Desvio Padrão: 0.03652641356015821
```

► Sintonizador dos melhores Hiperparâmetros

```
from loguru import logger
from sklearn.model_selection import GridSearchCV
from sklearn.neural_network import MLPClassifier

def perform_grid_search(X, y):
    logger.info("Iniciando a busca em grade para MLPClassifier.")

    mlp = MLPClassifier()
    param_grid = {
        'hidden_layer_sizes': [(5,), (10,), (15,)],
        'max_iter': [2000, 5000],
        'activation': ['logistic'],
        'solver': ['sgd', 'adam'],
        'learning_rate': ['constant', 'adaptive'],
    }

    grid = GridSearchCV(mlp, param_grid, n_jobs=-1, cv=10)
    logger.info("Realizando o ajuste do grid search com os dados
    fornecidos.")
    grid.fit(X, y)

    logger.info("Grid search completo.")
    logger.info(f"Melhores parâmetros: {grid.best_params_}")
    logger.info(f"Melhor pontuação: {grid.best_score_}")

    return grid
```

```
grid_result = perform_grid_search(X, target)
```

```
2024-06-03 12:52:10.403 | INFO      | __main__:perform_grid_search:6 -
Iniciando a busca em grade para MLPClassifier.
```

```
2024-06-03 12:52:10.405 | INFO      | __main__:perform_grid_search:18 -
Realizando o ajuste do grid search com os dados fornecidos.
```

```
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/
neural_network/_multilayer_perceptron.py:1105: DataConversionWarning:
A column-vector y was passed when a 1d array was expected. Please
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```

```
    y = column_or_1d(y, warn=True)
```

```
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```
/home/juannascimento/Modelos/env/lib/python3.10/site-packages/sklearn/
```

```
neural_network/_multilayer_perceptron.py:1105: DataConversionWarning:
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```



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2024-06-03 12:52:30.225 | INFO      | __main__:perform_grid_search:21 -
Grid search completo.
2024-06-03 12:52:30.225 | INFO      | __main__:perform_grid_search:22 -
Melhores parâmetros: {'activation': 'logistic', 'hidden_layer_sizes':
(10,), 'learning_rate': 'constant', 'max_iter': 2000, 'solver':
'adam'}
2024-06-03 12:52:30.226 | INFO      | __main__:perform_grid_search:23 -
Melhor pontuação: 0.9461904761904762

from loguru import logger

def log_grid_search_results(grid):
    logger.info("Melhores valores dos parâmetros do grid:")
    logger.info(grid.best_params_)

```

```
logger.info("Parâmetros mais relevantes para estimar:")
logger.info(grid.best_estimator_)
logger.info("Melhor acurácia:")
logger.info(grid.best_score_)

log_grid_search_results(grid_result)

2024-06-03 12:52:48.312 | INFO |
__main__:log_grid_search_results:4 - Melhores valores dos parâmetros
do grid:
2024-06-03 12:52:48.313 | INFO |
__main__:log_grid_search_results:5 - {'activation': 'logistic',
'hidden_layer_sizes': (10,), 'learning_rate': 'constant', 'max_iter':
2000, 'solver': 'adam'}
2024-06-03 12:52:48.314 | INFO |
__main__:log_grid_search_results:6 - Parâmetros mais relevantes para
estimar:
2024-06-03 12:52:48.315 | INFO |
__main__:log_grid_search_results:7 -
MLPClassifier(activation='logistic', hidden_layer_sizes=(10,),
max_iter=2000)
2024-06-03 12:52:48.317 | INFO |
__main__:log_grid_search_results:8 - Melhor acurácia:
2024-06-03 12:52:48.317 | INFO |
__main__:log_grid_search_results:9 - 0.9461904761904762
```