## SELEÇÃO DO ALGORITMO DE APRENDIZAGEM DE MÁQUINA

Wendley, 06/11/2018

## Algumas linhas do arquivo CSV:

,rssi,prr,prr2,snr,txentrega,relacao,latencia-ms,potencia

61,-109.160458782,0.5,0.5,-3.4127756946,44.4444444444,7.875,999.0,45.0

62, -109.144513482, 0.5, 0.5, -3.94957215834, 42.1052631579, 8.0, 999.0, 45.0

63,-109.1324661,0.5,0.5,-1.94352365376,42.1052631579,8.125,999.0,45.0

64,-109.090254156,0.5,0.5,-3.53613334798,42.1052631579,8.25,999.0,45.0

65,-109.194556812,0.5,0.5,-2.91647114115,40.0,8.375,999.0,45.0

66,-109.240579826,0.5,0.5,-3.56539245306,40.0,8.5,999.0,45.0

Disponível em: <a href="https://github.com/wendley/sdr/blob/master/traces-Cen1a4.csv">https://github.com/wendley/sdr/blob/master/traces-Cen1a4.csv</a> (71472 linhas)

## Métodos utilizados nos testes:

- Validação cruzada (Cross-validation) com Shuffle Split
- Validação cruzada com kFold
- Proporção 80%/20%

Inputs: ['rssi','prr','snr']
Target: 'txentrega'

	Acurácia Cross Validation (Shuffle split=5)	Acurácia Cross Validation (Kfold=5)	80% / 20% RMSE	80% / 20% Explained variance score *	80% / 20% MAE
Linear Regression	0.93 (+/- 0.00)	0.93 (+/- 0.00)	8.6708	0.9286	5.6977
SVR	0.92 (+/- 0.00)	0.92 (+/- 0.00)	9.0880	0.9217	4.8781
LinearSVR	0.90 (+/- 0.03)	0.90 (+/- 0.04)	10.2189	0.9240	6.6723
NuSVR	0.78 (+/- 0.00)	0.78 (+/- 0.01)	14.9823	0.8152	13.5685
KNN	0.94 (+/- 0.00)	0.94 (+/- 0.00)	7.6541	0.9444	3.9763
Decision Tree Reg.	0.97 (+/- 0.00)	0.97 (+/- 0.00)	5.7607	0.9685	2.3567
NNet	0.95 (+/- 0.03)	0.95 (+/- 0.02)	8.4909	0.9327	5.9932
GBE	0.97 (+/- 0.00)	0.97 (+/- 0.00)	5.7263	0.9688	3.1882

<sup>\*</sup> Explained variance regression score function: Best possible score is 1.0, lower values are worse.

A seguir, mais detalhes sobre o tempo de execução e outras métricas (R2 e MSE)

**Cross validation com shuffle split** -----Scores 1 - LinearRegression: [ 0.92444975 0.92863816 0.92941018 0.92749279 0.92708773] Accuracy: 0.93 (+/- 0.00) Tempo de cross validation: 0:00:00.339168 Scores 2 - SVR: [ 0.91664057 0.92272254 0.92365913 0.92075292 0.92030868] Accuracy: 0.92 (+/- 0.00) Tempo de cross validation: 0:27:34.783880 Scores 3 - LinearSVR:  $[\ 0.89745628\ \ 0.90176684\ \ 0.92292723\ \ 0.91546824\ \ 0.88434001]$ Accuracy: 0.90 (+/- 0.03) Tempo de cross validation: 0:00:40.894546 Scores 4 - NuSVR: [ 0.78263038 0.78525376 0.78479349 0.7813724 0.7831869 ] Accuracy: 0.78 (+/- 0.00) Tempo de cross validation: 0:06:54.158864 Scores 5 - KNN:  $[\ 0.93984595\ \ 0.94454279\ \ 0.94497517\ \ 0.94028477\ \ 0.94371393]$ Accuracy: 0.94 (+/- 0.00) Tempo de cross validation: 0:00:00.595204

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Scores 6 - DecisionTreeRegressor:

 $[\ 0.9653723\ \ 0.96882996\ \ 0.96701018\ \ 0.96831844\ \ 0.96401301]$ 

Accuracy: 0.97 (+/- 0.00) Tempo de cross validation:

0:00:02.027357

Scores 7 - NNet: [ 0.92669126  0.962206   0.93311013  0.9617979  0.95679611] Accuracy: 0.95 (+/- 0.03) Tempo de cross validation: 0:03:58.837893
<del></del>
Scores 8 - GBE: [ 0.96717125  0.96908217  0.96976121  0.96851752  0.9675402 ] Accuracy: 0.97 (+/- 0.00) Tempo de cross validation: 0:00:10.941112
Cross validation com KFold = 5
Scores 1 - LinearRegression: [ 0.92753751  0.92527324  0.92846216  0.92717315  0.92865424] Accuracy: 0.93 (+/- 0.00) Tempo de cross validation: 0:00:00.332766
Scores 2 - SVR: [ 0.92064519  0.91984772  0.92141502  0.92077003  0.92162819] Accuracy: 0.92 (+/- 0.00) Tempo de cross validation: 0:27:18.859683

[ 0.8728417 0.91592413 0.92217188 0.91792192 0.89289644] Accuracy: 0.90 (+/- 0.04) Tempo de cross validation: 0:00:41.007015

Scores 4 - NuSVR: [ 0.7844322
Scores 5 - KNN: [ 0.9403039
Scores 6 - DecisionTreeRegressor: [ 0.96636489  0.965202
Scores 7 - NNet: [ 0.93067327  0.95056222  0.96184397  0.95997811  0.95111198] Accuracy: 0.95 (+/- 0.02) Tempo de cross validation: 0:03:51.281845
Scores 8 - GBE: [ 0.9683126  0.9679189  0.96849253  0.96884281  0.9691194 ] Accuracy: 0.97 (+/- 0.00) Tempo de cross validation: 0:00:11.042854

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## LinearRegression -----Tempo de treinamento/carregamento: 0:00:00.005924 Tempo de predicao: 0:00:00.000426 r2 score: 0.928660 mse: 75.183444 rmse: 8.670838714 mae: 5.697742 explained variance score: 0.928660 SVR -----Tempo de treinamento/carregamento: 0:03:49.874539 Tempo de predicao: 0:00:18.930311 r2 score: 0.921630 mse: 82.592285 rmse: 9.088029764 mae: 4.878133 explained variance score: 0.921751 Linear SVR -----Tempo de treinamento/carregamento: 0:00:06.986434 Tempo de predicao: 0:00:00.000340 r2 score: 0.900911 mse: 104.427458 rmse: 10.218975389 mae: 6.672393 explained variance score: 0.924046

NuSVR
Tempo de treinamento/carregamento: 0:01:20.147258 Tempo de predicao: 0:00:02.507026 r2 score: 0.787005
mse: 224.470249 rmse: 14.982331227
mae: 13.568541
explained variance score: 0.815299
KNN
Tempo de treinamento/carregamento: 0:00:00.056518
Tempo de predicao: 0:00:00.074330
r2 score: 0.944409
mse: 58.586560
rmse: 7.654185783
mae: 3.976390 explained variance score: 0.944413
explained variance score, 0.5 11115
DecisionTreeRegressor
Tempo de treinamento/carregamento: 0:00:00.444863
Tempo de predicao:
0:00:00.007448
r2 score: 0.968511 mse: 33.185952
rmse: 5.760724954
mae: 2.356724
explained variance score: 0.968531

NNet -----

Tempo de treinamento/carregamento:

0:00:11.260512 Tempo de predicao: 0:00:00.036005 r2 score: 0.931589

mse: 72.096447 rmse: 8.490962666 mae: 5.993289

explained variance score: 0.932753

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GBE -----

Tempo de treinamento/carregamento:

0:00:02.238957 Tempo de predicao: 0:00:00.021074 r2 score: 0.968885

mse: 32.791239 rmse: 5.726363506 mae: 3.188219

explained variance score: 0.968893

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