```
EVALUATING ACCURACY OF THE CLASSIFIERS
LOGISTICS REGRESSIONS
=== Run information ===
Scheme:weka.classifiers.functions.Logistic -R 1.0E-8 -M -1
Relation:
          german credit
Instances: 1000
Attributes: 21
       checking status
       duration
       credit_history
       purpose
       credit amount
       savings status
       employment
       installment_commitment
       personal status
       other_parties
       residence_since
       property_magnitude
       age
       other_payment_plans
       housing
       existing_credits
       job
       num dependents
       own telephone
       foreign worker
       class
Test mode: 10-fold cross-validation
=== Classifier model (full training set) ===
Logistic Regression with ridge parameter of 1.0E-8
Coefficients...
                            Class
Variable
                               good
______
                                   -0.778
checking status=<0
checking status=0<=X<200
                                      -0.4032
checking status=>=200
                                    0.1877
checking status=no checking
                                      0.9338
                             -0.0279
duration
                                    -0.8129
credit history=no credits/all paid
credit history=all paid
                                 -0.9562
```

credit_history=existing paid	-0.2268
credit_history=delayed previously	0.0403
credit_history=critical/other existing	credit 0.6229
purpose=new car	-0.692
purpose=used car	0.9744
purpose=furniture/equipment	0.0996
purpose=radio/tv	0.1996
purpose=domestic appliance	-0.1692
purpose=repairs	-0.4756
purpose=education	-0.7283
purpose=vacation	0
purpose=retraining	1.3674
purpose=business	0.0481
purpose=other	0.7968
credit_amount	-0.0001
savings_status=<100	-0.4402
savings_status=100<=X<500	-0.0825
savings_status=500<=X<1000	-0.0641
savings_status=>=1000	0.8989
savings_status=no known savings	0.5065
employment=unemployed	-0.2934
employment=<1	-0.2265
employment=1<=X<4	-0.1106
employment=4<=X<7	0.5376
employment=>=7	-0.0168
installment_commitment	-0.3301
personal_status=male div/sep	-0.4923
personal_status=female div/dep/ma	ar -0.2168
personal_status=male single	0.3238
personal_status=male mar/wid	-0.1252
personal_status=female single	0
other_parties=none	-0.1798
other_parties=co applicant	-0.6158
other_parties=guarantor	0.7988
residence_since	-0.0048
property_magnitude=real estate	0.2572
property_magnitude=life insurance	-0.0242
property_magnitude=car	0.0627
property_magnitude=no known pro	perty -0.4732
age 0.	0145
other_payment_plans=bank	-0.3273
other_payment_plans=stores	-0.2041
other_payment_plans=none	0.3191

housing=rent housing=own housing=for free existing_credits job=unemp/unskilled non res job=unskilled resident job=skilled job=high qualif/self emp/mgmt num_dependents	-0.3498 0.0939 0.3341 -0.2721 0.5095 -0.0265 -0.0451 0.0301 -0.2647
own_telephone foreign_worker Intercept	0.3 1.3922 3.1983
Odds Ratios	
Variable	Class good ==================================
checking_status=<0	0.4593
checking_status=0<=X<200	0.6682
checking status=>=200	1.2064
checking_status=no checking	2.5443
duration	0.9725
credit_history=no credits/all paid	0.4436
credit history=all paid	0.3843
credit history=existing paid	0.7971
credit history=delayed previously	1.0411
credit_history=critical/other existing	ng credit 1.8643
purpose=new car	0.5006
purpose=used car	2.6497
purpose=furniture/equipment	1.1047
purpose=radio/tv	1.2209
purpose=domestic appliance	0.8443
purpose=repairs	0.6215
purpose=education	0.4827
purpose=vacation	1
purpose=retraining	3.9251
purpose=business	1.0493
purpose=other	2.2184
credit_amount	0.0000
savings_status=<100	0.9999
<del>-</del>	0.6439
savings_status=100 savings_status=100<=X<500 savings_status=500<=X<1000	

2.4569

savings\_status=>=1000

savings_status=no known saving	ıs 1.6594	
employment=unemployed	0.7457	
employment=<1	0.7973	
employment=1<=X<4	0.8953	
employment=4<=X<7	1.7119	
employment=>=7	0.9834	
installment commitment	0.7189	
personal_status=male div/sep	0.6112	
personal_status=female div/dep/r		
personal_status=male single	1.3824	
personal status=male mar/wid	0,8823	
personal_status=female single	1	
other parties=none	0.8354	
other_parties=co applicant	0,5402	
other_parties=guarantor	2,2229	
residence_since	0.9952	
property_magnitude=real estate	1.2933	
property_magnitude=life insurance		
property_magnitude=car	1.0647	
property_magnitude=no known p		
age	1.0146	
other_payment_plans=bank	0.7209	
other_payment_plans=stores	0.8154	
other_payment_plans=none	1.3758	
housing=rent	0.7049	
housing=own	1.0984	
housing=for free	1.3967	
existing_credits	0.7618	
job=unemp/unskilled non res	1.6645	
job=unskilled resident	0.9738	
job=skilled	0.9559	
job=high qualif/self emp/mgmt	1.0306	
num_dependents	0.7675	
own_telephone	1.3499	
foreign_worker	4.0237	
Time taken to build model: 0.09 s	seconds	
=== Stratified cross-validation ==	:=	
=== Summary ===		
Correctly Classified Instances	752         75.2     %	ó
Incorrectly Classified Instances	248 24.8 %	6
• •	375	
Mean absolute error	0.3098	
Root mean squared error	0.4087	

```
Relative absolute error
                              73.727 %
                               89.1751 %
Root relative squared error
Total Number of Instances
                               1000
=== Detailed Accuracy By Class ===
        TP Rate FP Rate Precision Recall F-Measure ROC Area Class
         0.864
                 0.51
                         0.798
                                 0.864
                                          0.83
                                                  0.785
                                                         good
         0.49
                 0.136
                         0.607
                                 0.49
                                         0.542
                                                  0.785
                                                         bad
Weighted Avg. 0.752 0.398
                                0.741
                                        0.752
                                                0.744
                                                         0.785
=== Confusion Matrix ===
 a b <-- classified as
605 95 | a = good
153 147 | b = bad
NAVIVE BAYES ALGORITHM
=== Run information ===
Scheme:weka.classifiers.bayes.NaiveBayes
Relation:
           german_credit
Instances: 1000
Attributes: 21
        checking_status
        duration
        credit_history
        purpose
        credit amount
        savings status
        employment
        installment commitment
        personal status
        other parties
        residence since
        property magnitude
        age
        other payment plans
        housing
        existing credits
       job
        num dependents
        own telephone
        foreign worker
        class
Test mode:10-fold cross-validation
```

=== Classifier model (full training set) ===

## Naive Bayes Classifier

Class

Attribute good bad (0.7) (0.3)

:========

abading status	
checking_status	140.0 126.0
<0	140.0 136.0
0<=X<200	165.0 106.0
>=200	50.0 15.0
no checking	349.0 47.0
[total]	704.0 304.0
duration	40.4700.04.0400
mean	19.1766 24.8129
std. dev.	10.9817 13.3608
weight sum	700 300
precision	2.125 2.125
credit_history	
no credits/all paid	16.0 26.0
all paid	22.0 29.0
existing paid	362.0 170.0
delayed previously	61.0 29.0
critical/other existing	
[total]	705.0 305.0
purpose	
new car	146.0 90.0
used car	87.0 18.0
furniture/equipment	124.0 59.0
radio/tv	219.0 63.0
domestic appliance	9.0 5.0
repairs	15.0 9.0
education	29.0 23.0
vacation	1.0 1.0
retraining	9.0 2.0
business	64.0 35.0
other	8.0 6.0
[total]	711.0 311.0
credit_amount	
mean	2985.6721 3938.1609
std. dev.	2399.7801 3529.4788
weight sum	700 300
precision	19.7543 19.7543
savings_status	

<100	387.0 218.0
100<=X<500	70.0 35.0
500<=X<1000	53.0 12.0
>=1000	43.0 7.0
no known savings	152.0 33.0
[total]	705.0 305.0
employment	
unemployed	40.0 24.0
<1	103.0 71.0
1<=X<4	236.0 105.0
4<=X<7	136.0 40.0
>=7	190.0 65.0
[total]	705.0 305.0
installment_commitment	
mean	2.92 3.0967
std. dev.	1.1273 1.0866
weight sum	700 300
precision	1 1
personal_status	
male div/sep	31.0 21.0
female div/dep/mar	202.0 110.0
male single	403.0 147.0
male mar/wid	68.0 26.0
female single	1.0 1.0
[total]	705.0 305.0
other_parties	
none	636.0 273.0
co applicant	24.0 19.0
guarantor	43.0 11.0
[total]	703.0 303.0
residence_since	
mean	2.8429 2.85
std. dev.	1.1076 1.0928
weight sum	700 300
precision	1 1
property_magnitude	
real estate	223.0 61.0
life insurance	162.0 72.0
car	231.0 103.0
no known property	88.0 68.0
[total]	704.0 304.0
age	
mean	36.1723 33.9267

std. dev.	11.4005 11.259	
weight sum	700 300	
precision	1.0769 1.0769	
other_payment_plans		
bank	83.0 58.0	
stores	29.0 20.0	
none	591.0 225.0	
[total]	703.0 303.0	
housing		
rent	110.0 71.0	
own	528.0 187.0	
for free	65.0 45.0	
[total]	703.0 303.0	
existing credits		
mean	1,4243 1,3667	
std. dev.	0.5843 0.5588	
weight sum	700 300	
precision	1 1	
job	, ,	
unemp/unskilled non re	s 16.0 8.0	
unskilled resident	145.0 57.0	
skilled	445.0 187.0	
high qualif/self emp/mg	704.0 304.0	
[total]	704.0 304.0	
num dependents		
mean	1.1557 1.1533	
std. dev.	0.3626 0.3603	
weight sum	700 300	
	1 1	
precision	1 1	
own_telephone		
none	410.0 188.0	
yes	292.0 114.0	
[total]	702.0 302.0	
[]		
foreign_worker		
yes	668.0 297.0	
no	34.0 5.0	
[total]	702.0 302.0	
Time taken to build model: 0 seconds		
=== Stratified cross-valid	lation ===	
=== Summary ===		
•		

```
Correctly Classified Instances
                                 754
                                             75.4
                                                    %
Incorrectly Classified Instances
                                 246
                                             24.6
                                                    %
Kappa statistic
                            0.3813
Mean absolute error
                               0.2936
Root mean squared error
                                  0.4201
Relative absolute error
                               69.8801 %
Root relative squared error
                                91.6718 %
Total Number of Instances
                                1000
=== Detailed Accuracy By Class ===
        TP Rate FP Rate Precision Recall F-Measure ROC Area Class
         0.864
                  0.503
                           8.0
                                  0.864
                                          0.831
                                                   0.787
                                                          good
         0.497
                  0.136
                           0.611
                                   0.497
                                           0.548
                                                    0.787
                                                           bad
Weighted Avg. 0.754 0.393
                                 0.743
                                        0.754
                                                 0.746
                                                          0.787
=== Confusion Matrix ===
 a b <-- classified as
605 95 | a = good
151 149 | b = bad
TREE- J48
=== Run information ===
Scheme:weka.classifiers.trees.J48 -C 0.25 -M 2
Relation:
           german credit
Instances:
           1000
Attributes: 21
        checking status
        duration
        credit history
        purpose
        credit amount
        savings status
        employment
        installment commitment
        personal_status
        other parties
        residence since
        property magnitude
        age
        other payment plans
        housing
        existing credits
```

```
job
    num dependents
    own telephone
    foreign worker
    class
Test mode:10-fold cross-validation
=== Classifier model (full training set) ===
J48 pruned tree
checking status = <0
| foreign worker = yes
| | duration <= 11
| | existing_credits <= 1
| | | property magnitude = real estate: good (8.0/1.0)
| | | property_magnitude = car: good (2.0/1.0)
| | | property_magnitude = no known property: bad (3.0)
| | duration > 11
| | job = unemp/unskilled non res: bad (5.0/1.0)
|  |  | job = unskilled resident
| | | employment = unemployed: good (0.0)
 | | | | existing credits <= 1: bad (10.0/3.0)
| | | | existing credits > 1: good (2.0)
| | | purpose = domestic appliance: bad (1.0)
| | | purpose = education: bad (1.0)
| | | purpose = vacation: bad (0.0)
```

```
| | | purpose = retraining: good (1.0)
| | | purpose = business: good (3.0)
| | other parties = none
  | | | | credit history = no credits/all paid: bad (8.0/1.0)
       | | credit_history = all paid: bad (6.0)
| | | | | | credit history = existing paid
  | | | | | | property magnitude = real estate
          | | | | | | | age > 26: good (2.0)
       | | | | property_magnitude = life insurance: bad (7.0/2.0)
    | | | | | credit_amount <= 1386: bad (3.0)
     | | | | | | | credit amount > 1386: good (11.0/1.0)
  | | | | | | property magnitude = no known property: good (2.0)
    | | | | credit_history = delayed previously: bad (4.0)
  | | | | credit_history = critical/other existing credit: good (14.0/4.0)
  | | | | credit_history = no credits/all paid: good (0.0)
  | | | | | credit history = all paid: good (1.0)
  | | | | credit history = existing paid: bad (3.0)
  | | | | credit history = delayed previously: good (0.0)
  | | | | credit history = critical/other existing credit: good (2.0)
  | | | | savings status = 500<=X<1000: good (4.0/1.0)
  | | | | savings status = no known savings
 | | | | duration > 30: bad (30.0/3.0)
| \ | \ | \ | other parties = co applicant: bad (7.0/1.0)
| | | other parties = guarantor: good (12.0/3.0)
| | job = high qualif/self emp/mgmt: good (30.0/8.0)
foreign worker = no: good(15.0/2.0)
checking status = 0<=X<200
```

```
credit amount <= 9857
| | savings status = <100
| | personal status = male div/sep: bad (8.0/2.0)
  | purpose = used car: bad (1.0)
       | purpose = furniture/equipment
  | | | | duration <= 10: bad (3.0)
          duration > 10
         | duration <= 21: good (6.0/1.0)
       purpose = radio/tv: good (8.0/2.0)
  | | | purpose = domestic appliance: good (0.0)
  purpose = vacation: good (0.0)
        purpose = retraining: good (0.0)
        purpose = business
       | residence_since <= 2: good (3.0)
  | | personal_status = male single: good (52.0/15.0)
  | | | | | duration > 10: bad (10.0/3.0)
| | | | personal_status = female single: good (0.0)
| | | duration > 42: bad (7.0)
| | other parties = co applicant: good (2.0)
| | | other parties = guarantor
| | purpose = used car: good (0.0)
| | | purpose = furniture/equipment: good (0.0)
| | | purpose = domestic appliance: good (0.0)
| | | purpose = education: good (0.0)
| | | purpose = vacation: good (0.0)
| | | purpose = retraining: good (0.0)
| | | purpose = business: good (0.0)
| | savings status = 100<=X<500
```

```
| | purpose = new car: bad (15.0/5.0)
| | purpose = used car: good (3.0)
| | purpose = furniture/equipment: bad (4.0/1.0)
| | | purpose = domestic appliance: good (0.0)
 | | purpose = repairs: good (2.0)
  | purpose = education: good (0.0)
| | purpose = vacation: good (0.0)
| | purpose = retraining: good (0.0)
| | housing = rent
  | | existing credits <= 1: good (2.0)
 | | savings status = 500<=X<1000: good (11.0/3.0)
| | savings status = \geq 1000: good (13.0/3.0)
| | savings status = no known savings: good (41.0/5.0)
| credit amount > 9857: bad (20.0/3.0)
checking_status = >=200: good (63.0/14.0)
checking status = no checking: good (394.0/46.0)
Number of Leaves: 103
Size of the tree:
                 140
Time taken to build model: 0.03 seconds
=== Stratified cross-validation ===
=== Summary ===
Correctly Classified Instances
                            705
                                       70.5
                                            %
                            295
                                       29.5 %
Incorrectly Classified Instances
Kappa statistic
                        0.2467
Mean absolute error
                           0.3467
Root mean squared error
                             0.4796
Relative absolute error
                          82.5233 %
Root relative squared error
                           104.6565 %
Total Number of Instances
                           1000
=== Detailed Accuracy By Class ===
       TP Rate FP Rate Precision Recall F-Measure ROC Area Class
                                           0.639
        0.84
               0.61
                      0.763
                             0.84
                                   0.799
                                                 good
        0.39
               0.16
                      0.511
                             0.39
                                   0.442
                                           0.639
                                                 bad
Weighted Avg. 0.705
                    0.475
                            0.687
                                   0.705
                                          0.692
                                                  0.639
=== Confusion Matrix ===
```

```
a b <-- classified as
588 112 | a = good
183 117 | b = bad
LASY.IB1
=== Run information ===
Scheme:weka.classifiers.lazy.IB1
Relation:
           german_credit
Instances: 1000
Attributes: 21
        checking_status
        duration
        credit_history
        purpose
        credit_amount
        savings_status
        employment
        installment_commitment
        personal_status
        other_parties
        residence_since
        property magnitude
        age
        other_payment_plans
        housing
        existing credits
        job
        num dependents
        own telephone
        foreign worker
        class
Test mode:10-fold cross-validation
=== Classifier model (full training set) ===
IB1 classifier
Time taken to build model: 0 seconds
=== Stratified cross-validation ===
=== Summary ===
Correctly Classified Instances
                                 720
                                              72
                                                    %
Incorrectly Classified Instances
                                  280
                                              28
                                                    %
Kappa statistic
                             0.3243
```

0.28

Mean absolute error

```
Root mean squared error
                                  0.5292
Relative absolute error
                               66.6385 %
Root relative squared error
                                115.47 %
Total Number of Instances
                                1000
=== Detailed Accuracy By Class ===
        TP Rate FP Rate Precision Recall F-Measure ROC Area Class
         0.81
                         0.794
                                  0.81
                                         0.802
                                                  0.66
                 0.49
                                                         good
         0.51
                 0.19
                         0.535
                                  0.51
                                         0.522
                                                  0.66
                                                         bad
Weighted Avg. 0.72
                       0.4
                               0.716
                                      0.72
                                               0.718
                                                       0.66
=== Confusion Matrix ===
 a b <-- classified as
567 133 | a = good
147 153 | b = bad
SMO ALGORITHM
=== Run information ===
Scheme:weka.classifiers.functions.SMO -C 1.0 -L 0.001 -P 1.0E-12 -N 0 -V -1 -W 1 -K
"weka.classifiers.functions.supportVector.PolyKernel -C 250007 -E 1.0"
Relation:
           german credit
Instances:
           1000
Attributes: 21
        checking_status
        duration
        credit history
        purpose
        credit amount
        savings status
        employment
        installment commitment
        personal status
        other parties
        residence since
        property magnitude
        age
        other payment plans
        housing
        existing credits
        job
        num dependents
        own telephone
        foreign worker
        class
Test mode:10-fold cross-validation
```

```
=== ClasSifier model (full training set) ===
SMO
Kernel used:
 Linear Kernel: K(x,y) = \langle x,y \rangle
Classifier for classes: good, bad
BinarySMO
Machine linear: showing attribute weights, not support vectors.
     0.6805 * (normalized) checking status=<0
+
      0.3347 * (normalized) checking status=0<=X<200
+
     -0.4616 * (normalized) checking status=>=200
     -0.5537 * (normalized) checking status=no checking
+
      1.6987 * (normalized) duration
+
      0.5398 * (normalized) credit history=no credits/all paid
+
      0.6015 * (normalized) credit history=all paid
+
     -0.109 * (normalized) credit history=existing paid
+
     -0.3182 * (normalized) credit history=delayed previously
+
     -0.7141 * (normalized) credit history=critical/other existing credit
+
      0.5673 * (normalized) purpose=new car
+
     -0.5615 * (normalized) purpose=used car
+
     -0.1464 * (normalized) purpose=furniture/equipment
+
+
     -0.0798 * (normalized) purpose=radio/tv
      0.5456 * (normalized) purpose=domestic appliance
+
           * (normalized) purpose=repairs
+
      0.4441 * (normalized) purpose=education
     -0.3951 * (normalized) purpose=retraining
+
     -0.0823 * (normalized) purpose=business
     -0.2919 * (normalized) purpose=other
+
      1.1473 * (normalized) credit amount
+
+
      0.4056 * (normalized) savings status=<100
      0.115 * (normalized) savings status=100<=X<500
+
      0.1378 * (normalized) savings status=500<=X<1000
+
     -0.3775 * (normalized) savings status=>=1000
+
     -0.2809 * (normalized) savings status=no known savings
      0.2887 * (normalized) employment=unemployed
+
      0.1663 * (normalized) employment=<1
+
      0.0021 * (normalized) employment=1<=X<4
+
     -0.3348 * (normalized) employment=4<=X<7
+
     -0.1222 * (normalized) employment=>=7
+
      0.6503 * (normalized) installment commitment
      0.3335 * (normalized) personal status=male div/sep
      0.1177 * (normalized) personal status=female div/dep/mar
+
     -0.3697 * (normalized) personal status=male single
     -0.0815 * (normalized) personal status=male mar/wid
```

```
0.0514 * (normalized) other parties=none
+
+
      0.5697 * (normalized) other parties=co applicant
+
     -0.6211 * (normalized) other parties=guarantor
     -0.0001 * (normalized) residence since
+
     -0.2247 * (normalized) property magnitude=real estate
+
     -0.0544 * (normalized) property magnitude=life insurance
+
     -0.0795 * (normalized) property magnitude=car
     0.3586 * (normalized) property magnitude=no known property
+
+
     -0.4191 * (normalized) age
+
      0.0697 * (normalized) other payment plans=bank
      0.159 * (normalized) other payment plans=stores
+
     -0.2287 * (normalized) other payment plans=none
+
+
      0.3271 * (normalized) housing=rent
     -0.0702 * (normalized) housing=own
+
     -0.257 * (normalized) housing=for free
+
      0.4503 * (normalized) existing credits
+
     -0.2026 * (normalized) job=unemp/unskilled non res
+
      0.1501 * (normalized) job=unskilled resident
+
      0.1027 * (normalized) job=skilled
+
     -0.0502 * (normalized) job=high qualif/self emp/mgmt
+
+
     0.0198 * (normalized) num dependents
     -0.1394 * (normalized) own telephone
+
     -0.9888 * (normalized) foreign worker
+
     1.5398
Number of kernel evaluations: 436644 (90.558% cached)
Time taken to build model: 0.2 seconds
=== Stratified cross-validation ===
=== Summary ===
Correctly Classified Instances
                                  751
                                              75.1
                                                     %
                                              24.9
Incorrectly Classified Instances
                                  249
                                                     %
Kappa statistic
                             0.3654
Mean absolute error
                                0.249
Root mean squared error
                                  0.499
                                59.2607 %
Relative absolute error
Root relative squared error
                                108.8905 %
Total Number of Instances
                                 1000
=== Detailed Accuracy By Class ===
         TP Rate FP Rate Precision Recall F-Measure ROC Area Class
          0.871
                                   0.871
                                            0.83
                  0.53
                           0.793
                                                    0.671
                                                            good
          0.47
                  0.129
                           0.61
                                  0.47
                                          0.531
                                                   0.671
                                                           bad
Weighted Avg. 0.751
                        0.41
                                 0.738 0.751
                                                  0.741
                                                           0.671
=== Confusion Matrix ===
 a b <-- classified as
```

610 90 | a = good 159 141 | b = bad

## COMPARISION

## **GRAPHS**















