

# Supplement to: Estimating fractional snow cover from passive microwave brightness temperature data using MODIS snow cover product over North America

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Table S1. MODIS NDSI snow cover layer recoding description

| ID      | Description        | New ID                 |
|---------|--------------------|------------------------|
| 0 ~ 100 | NDSI snow cover    | Snow-covered/snow-free |
| 200     | Missing data       | Cloud                  |
| 201     | No decision        |                        |
| 211     | Night              |                        |
| 250     | Cloud              |                        |
| 254     | Detector saturated |                        |
| 237     | Inland water       | Water                  |
| 239     | Ocean              |                        |
| 255     | Fill               | Fill                   |

Table S2. The statistics of top nine important variables for random forest

| ID | Variables | Count (the maximum is 4) |
|----|-----------|--------------------------|
| 1  | Latitude  | 4                        |
| 2  | T37h      | 4                        |
| 3  | T37v      | 4                        |
| 4  | T85h      | 4                        |
| 5  | T85v      | 4                        |
| 6  | T_19v_37v | 4                        |
| 7  | T_22v_19v | 2                        |
| 8  | T_22v_85v | 4                        |
| 9  | T_37v_85v | 4                        |

5 Table S3. The optimization tests of learning rate of ANN on prairie dataset of 2017.

|                         | Test A-1 | Test A-2 | Test A-3 | Test A-4 |
|-------------------------|----------|----------|----------|----------|
| Hidden Layers           | 1        | 1        | 1        | 1        |
| Learning Rate           | 0.1      | 0.2      | 0.3      | 0.4      |
| R                       | 0.712    | 0.718    | 0.672    | 0.639    |
| MAE                     | 0.152    | 0.155    | 0.170    | 0.185    |
| RMSE                    | 0.192    | 0.198    | 0.212    | 0.230    |
| Time spent modeling / s | 50.86    | 13.18    | 13.95    | 13.47    |

Table S4. Variable selection tests in 6 scenarios on three land cover types (forest, shrub and prairie) for random forest method. The accuracy indexes of the estimation are calculated using OOB error estimates method.

| Land cover type | Indexes                 | Scenario-1 | Scenario-2 | Scenario-3 | Scenario-4 | Scenario-5 | Scenario-6 |
|-----------------|-------------------------|------------|------------|------------|------------|------------|------------|
| forest          | R                       | 0.699      | 0.594      | 0.505      | 0.696      | 0.688      | 0.646      |
|                 | MAE                     | 0.168      | 0.190      | 0.206      | 0.168      | 0.170      | 0.178      |
|                 | RMSE                    | 0.207      | 0.233      | 0.252      | 0.208      | 0.210      | 0.221      |
|                 | Time spent modeling / s | 8.38       | 6.81       | 3.77       | 6.34       | 6.4        | 6.73       |
| shrub           | R                       | 0.808      | 0.749      | 0.702      | 0.804      | 0.800      | 0.771      |
|                 | MAE                     | 0.140      | 0.158      | 0.169      | 0.141      | 0.142      | 0.151      |
|                 | RMSE                    | 0.187      | 0.209      | 0.226      | 0.188      | 0.190      | 0.201      |
|                 | Time spent modeling / s | 3.98       | 3.22       | 1.83       | 3.02       | 3.17       | 3.1        |
| prairie         | R                       | 0.743      | 0.650      | 0.599      | 0.743      | 0.743      | 0.698      |
|                 | MAE                     | 0.156      | 0.179      | 0.188      | 0.155      | 0.155      | 0.167      |
|                 | RMSE                    | 0.194      | 0.220      | 0.233      | 0.193      | 0.194      | 0.207      |
|                 | Time spent modeling / s | 8.45       | 6.82       | 4.18       | 7.08       | 6.53       | 6.43       |

Table S5. Variable selection tests in 6 scenarios on three land cover types (forest, shrub and prairie) for random forest method. The accuracy indexes of the estimation are calculated using 10-fold cross validation (CV).

| Land cover type | Indexes                 | Scenario-1 | Scenario-2 | Scenario-3 | Scenario-4 | Scenario-5 | Scenario-6 |
|-----------------|-------------------------|------------|------------|------------|------------|------------|------------|
| forest          | R                       | 0.704      | 0.599      | 0.506      | 0.699      | 0.693      | 0.652      |
|                 | MAE                     | 0.167      | 0.190      | 0.205      | 0.168      | 0.169      | 0.178      |
|                 | RMSE                    | 0.206      | 0.231      | 0.251      | 0.207      | 0.209      | 0.219      |
|                 | Time spent modeling / s | 8.38       | 6.81       | 3.77       | 6.34       | 6.4        | 6.73       |
| shrub           | R                       | 0.808      | 0.754      | 0.704      | 0.806      | 0.802      | 0.773      |
|                 | MAE                     | 0.140      | 0.157      | 0.169      | 0.140      | 0.142      | 0.150      |
|                 | RMSE                    | 0.187      | 0.208      | 0.225      | 0.187      | 0.189      | 0.200      |
|                 | Time spent modeling / s | 3.98       | 3.22       | 1.83       | 3.02       | 3.17       | 3.1        |
| prairie         | R                       | 0.746      | 0.659      | 0.606      | 0.746      | 0.747      | 0.701      |
|                 | MAE                     | 0.156      | 0.177      | 0.189      | 0.155      | 0.155      | 0.166      |
|                 | RMSE                    | 0.193      | 0.217      | 0.231      | 0.193      | 0.193      | 0.206      |
|                 | Time spent modeling / s | 8.45       | 6.82       | 4.18       | 7.08       | 6.53       | 6.43       |

Linear Regression formula, in which, FSC denotes fractional snow cover,  $a_1 \sim a_{12}$  means the regression coefficient of each variable, b is the intercept term:

$$FSC = a_1 * lat + a_2 * lon + a_3 * dem + a_4 * slope + a_5 * aspect + a_6 * T_{19v_{19h}} + a_7 * T_{19v_{37v}} + a_8 * T_{19h_{37h}} + a_9 * T_{22v_{19v}} + a_{10} * T_{22v_{85v}} + a_{11} * T_{37v_{37h}} + a_{12} * T_{37v_{85v}} + b \quad (S-1)$$

Table S6. The parameters of Linear regression formula

|          | Forest  | Shrub    | Prairie  | Bare land |
|----------|---------|----------|----------|-----------|
| $a_1$    | 1.7124  | 1.8286   | 1.3451   | 1.041     |
| $a_2$    | 0.5667  | 0.7326   | 0.3796   | 1.041     |
| $a_3$    | 0.6148  | 0.1765   | -0.1648  | 0.1324    |
| $a_4$    | -0.1449 | 0.2597   | -0.178   | 0.4921    |
| $a_5$    | 0.0266  | 0.0134   | -0.1605  | 0.0403    |
| $a_6$    | 10.1795 | 13.1437  | -23.7192 | 25.3841   |
| $a_7$    | -9.1104 | -4.7906  | 31.3559  | -32.695   |
| $a_8$    | 8.8293  | 12.7346  | -24.478  | 23.8666   |
| $a_9$    | -2.4825 | 8.1627   | 9.6261   | -7.1022   |
| $a_{10}$ | 2.2213  | -5.2339  | -4.2919  | 12.2749   |
| $a_{11}$ | -8.5071 | -12.9567 | 22.4968  | -23.3069  |
| $a_{12}$ | -0.8334 | 6.5589   | 6.4447   | -10.2661  |
| $b$      | -1.1476 | -9.7496  | -9.1063  | 4.9851    |

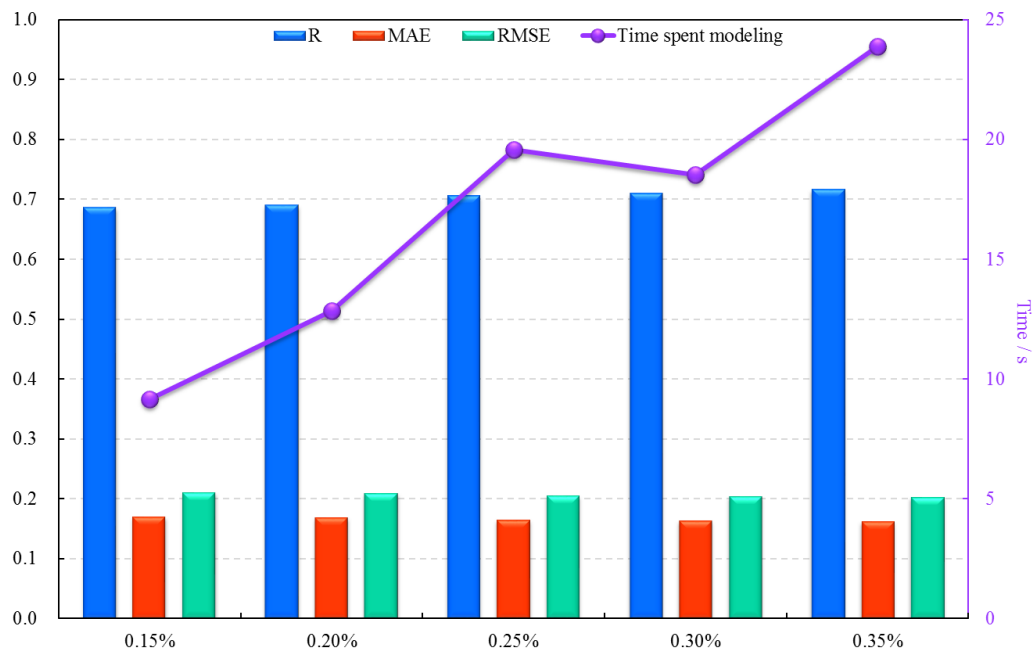
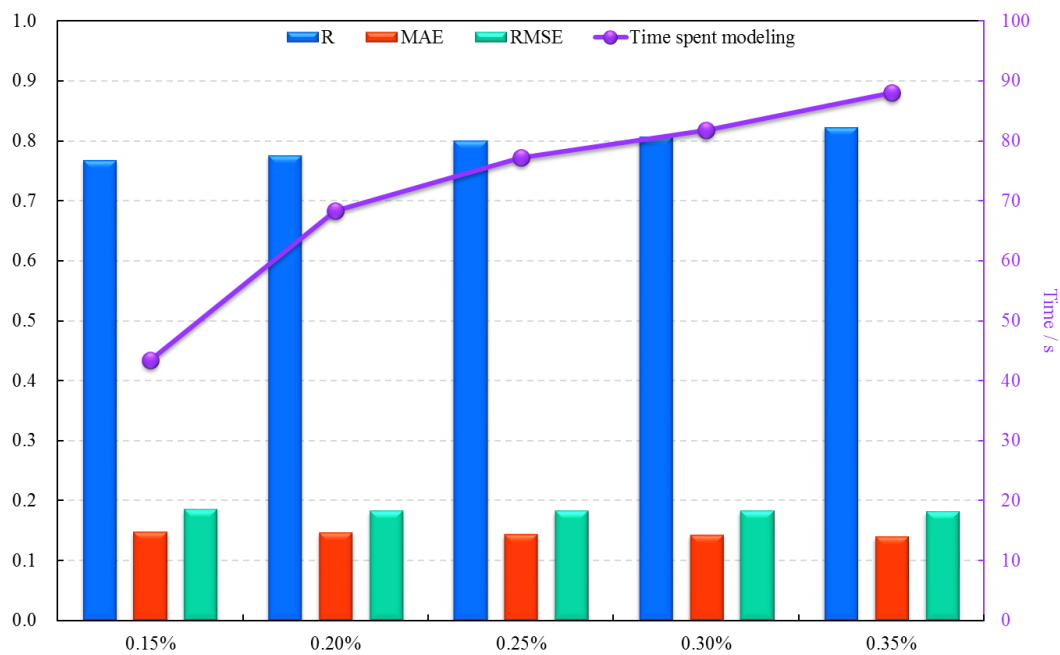


Figure S-1. Using OOB error estimates to evaluate the performance of random forest models with increasing training sample size for forest type



5 Figure S-2 Using OOB error estimates to evaluate the performance of random forest models with increasing training sample size for prairie type

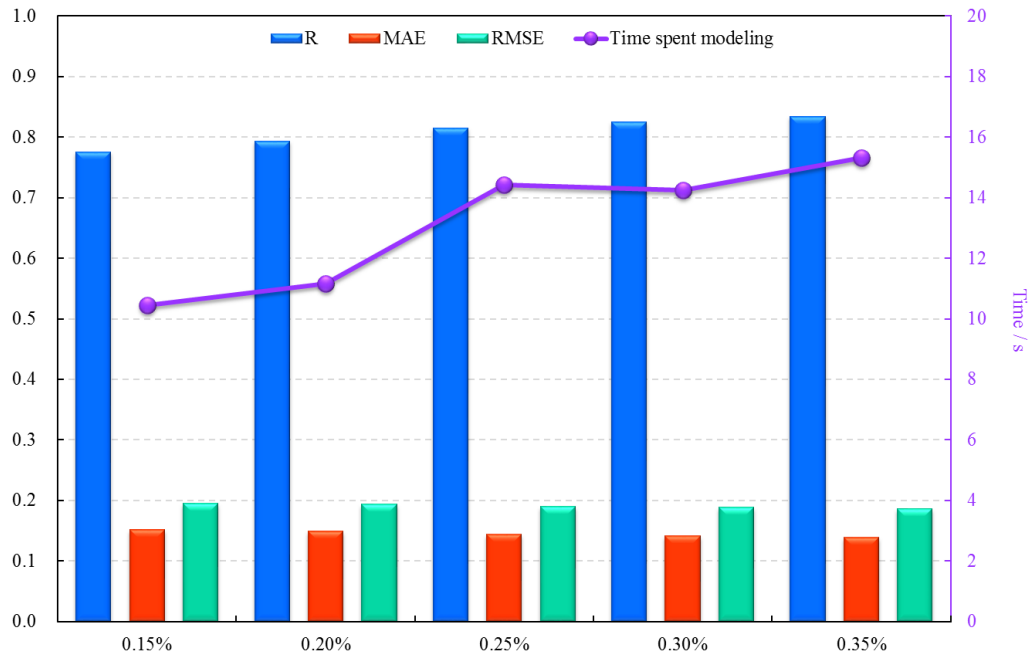


Figure S-3 Using OOB error estimates to evaluate the performance of random forest models with increasing training sample size for bare land type

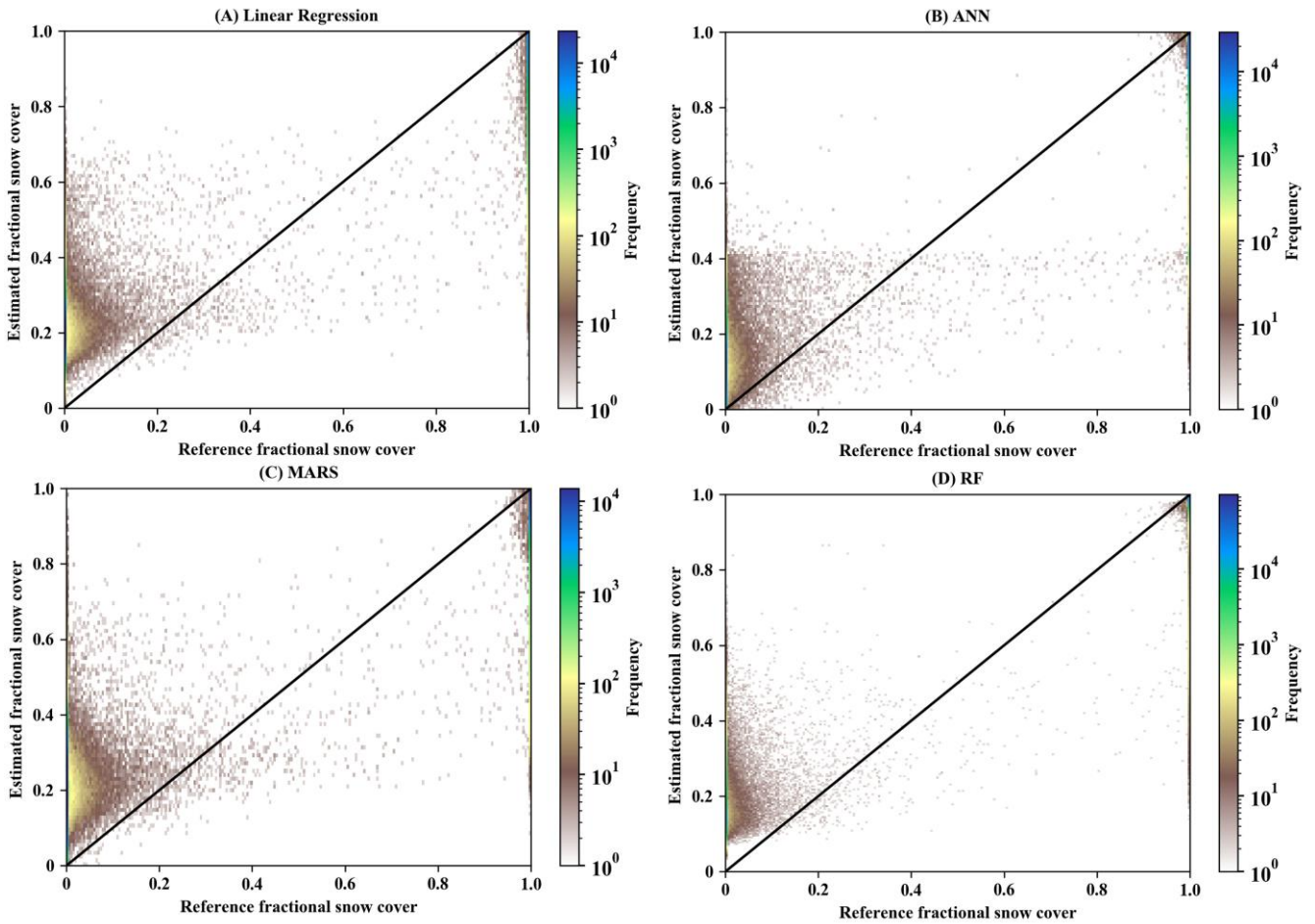


Figure S-4 The color-density scatter plots between the estimated fractional snow cover and MODIS-derived fractional snow cover for four algorithms (linear regression, ANN, MARS, and random forest) for shrub type. The accuracy metric refer to Table 5. [Note: out of range fractional snow cover values of linear regression, ANN and MARS were truncated on 0 and 1]

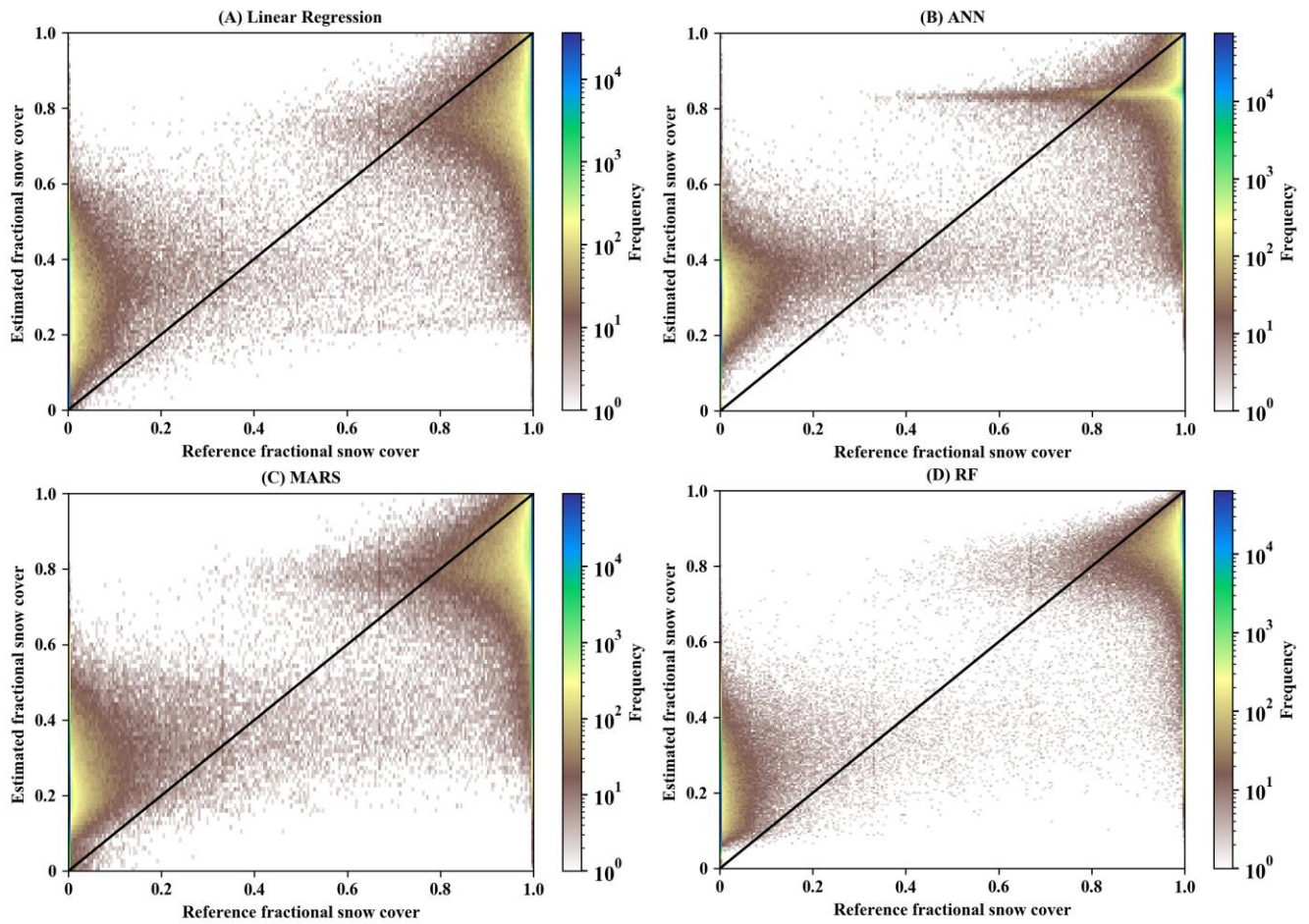


Figure S-5 The color-density scatter plots between the estimated fractional snow cover and MODIS-derived fractional snow cover for four algorithms (linear regression, ANN, MARS, and random forest) for prairie type. The accuracy metric refer to Table 5. [Note: out of range fractional snow cover values of linear regression, ANN and MARS were truncated on 0 and 1]



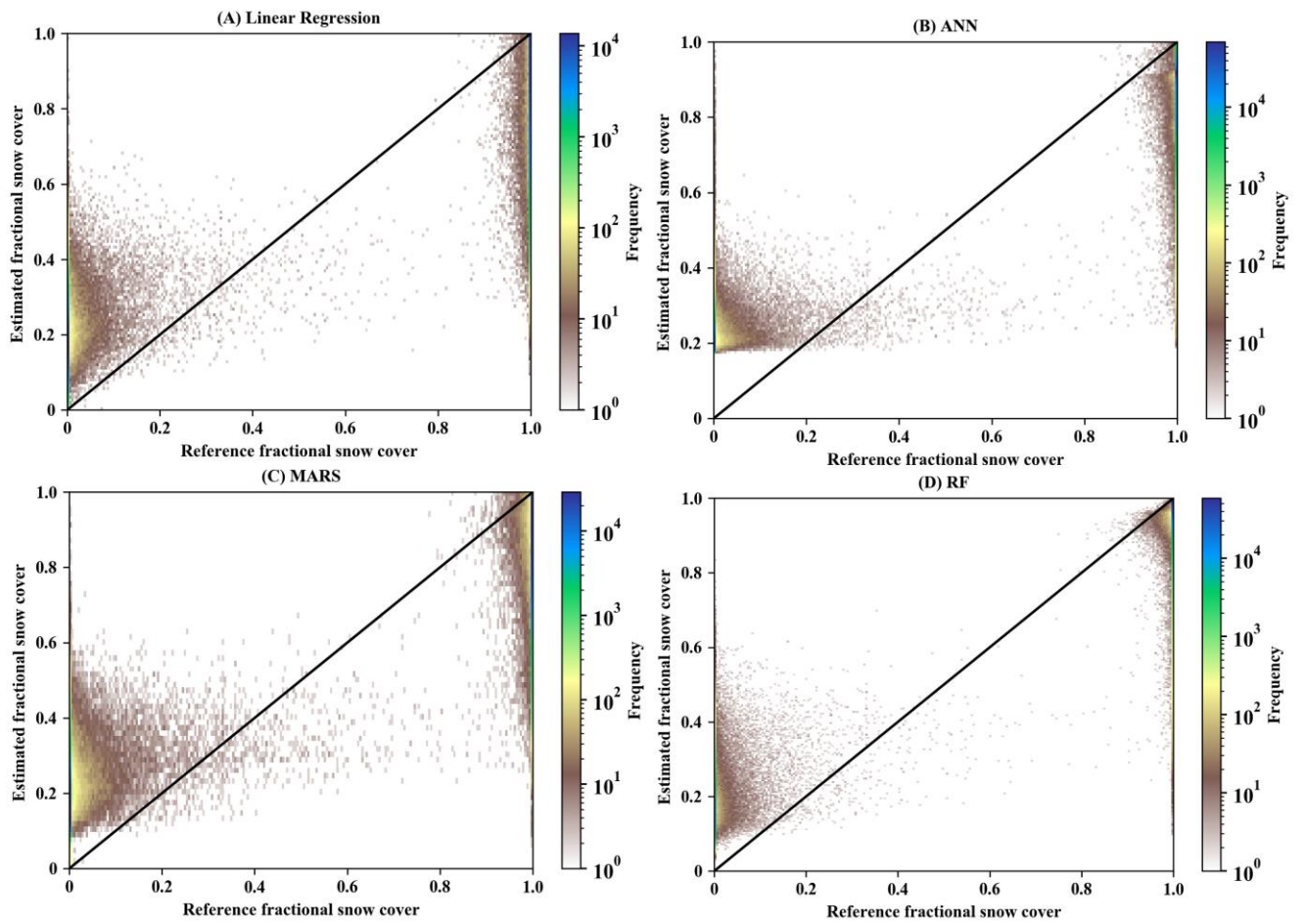


Figure S-6 The color-density scatter plots between the estimated fractional snow cover and MODIS-derived fractional snow cover for four algorithms (linear regression, ANN, MARS, and random forest) for bare land type. The accuracy metric refer to Table 5. [Note: out of range fractional snow cover values of linear regression, ANN and MARS were truncated on 0 and 1]

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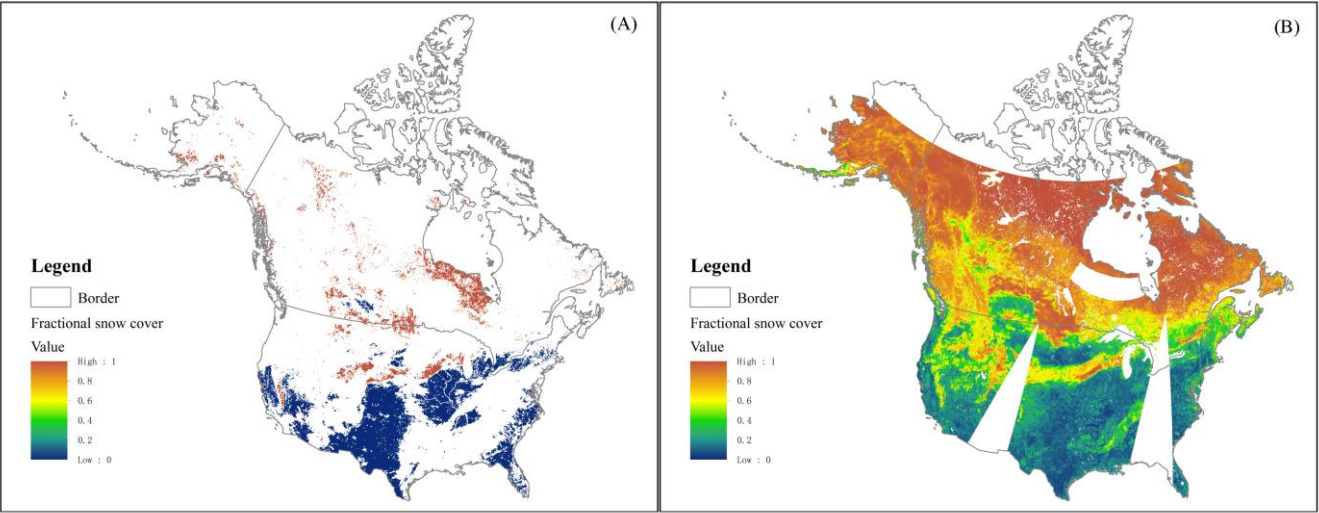


Figure S-7. Comparison of the reference MODIS fractional snow cover (A) with our estimated fractional snow cover (B) in continuous value (6.25-km) on February 27th, 2017 (2017058)

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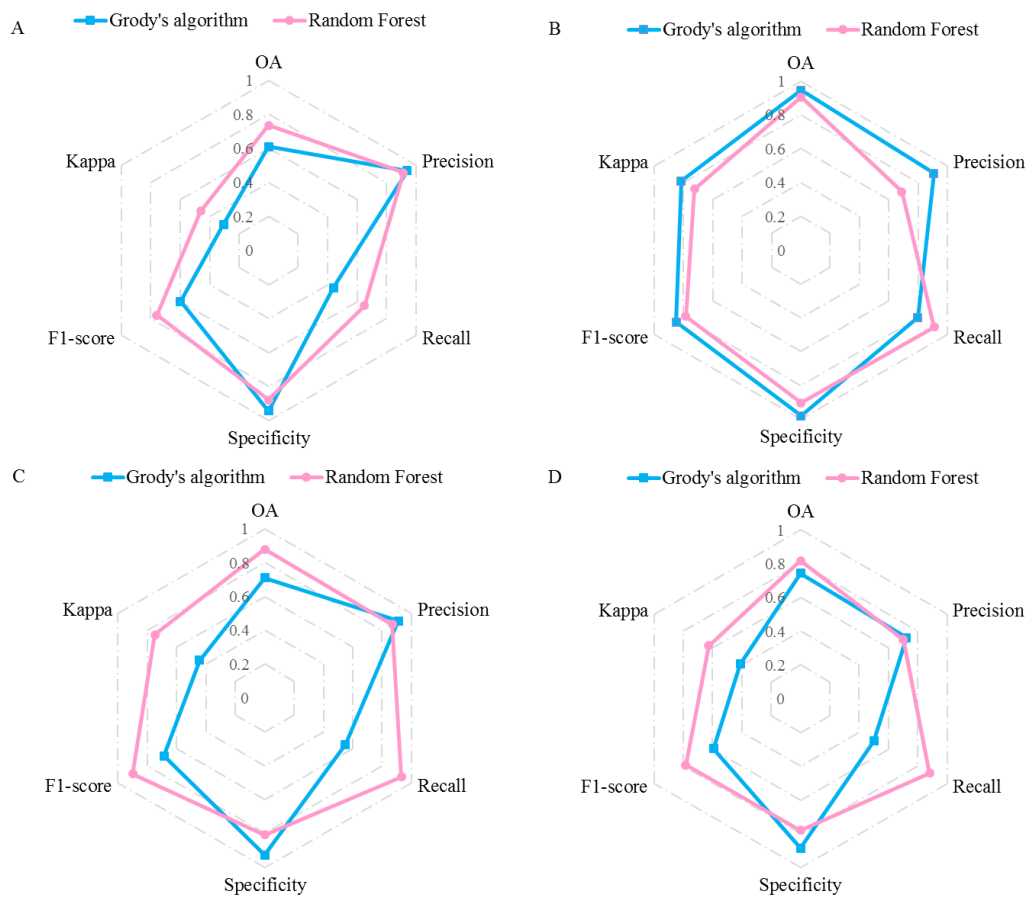


Figure. S-8. The accuracy indicators (OA, precision, recall, specificity, F1-score, kappa) of snow cover detection from two algorithm (Grody' algorithm; Random forest) for four land cover types (A: forest; B: shrub; C: prairie; D: bare land)