

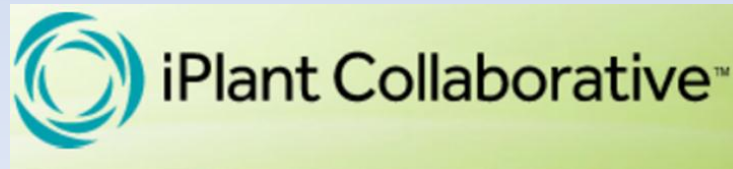
INTERPOLATED CLIMATE LAYERS FOR USE IN SPECIES MODELING:

Interpolation of temperatures

05-20-2013

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ROUND-UP IPLANT MEETING



MODELS TEMPERATURES PREDICTIONS STATUS

Venezuela: Models in green not predicted

Mod1: $y_var \sim s(elev_s)$

Mod2: $y_var \sim s(LST)$

Mod3: $y_var \sim s(elev_s, LST)$

Mod4: $y_var \sim s(lat) + s(lon) + s(elev_s)$

Mod5: $y_var \sim s(lat, lon, elev_s)$

Mod6: $y_var \sim s(lat, lon) + s(elev_s) + s(N_w, E_w) + s(LST)$,

Mod7: $y_var \sim s(lat, lon) + s(elev_s) + s(N_w, E_w) + s(LST) + s(LC2)$

Mod8: $y_var \sim s(lat, lon) + s(elev_s) + s(N_w, E_w) + s(LST) + s(LC6)$

Mod9: $y_var \sim s(lat, lon) + s(elev_s) + s(N_w, E_w) + s(LST) + s(DISTOC)$

Mod_kr: kriging

METHOD: GAM CAI

With GAM and Kriging

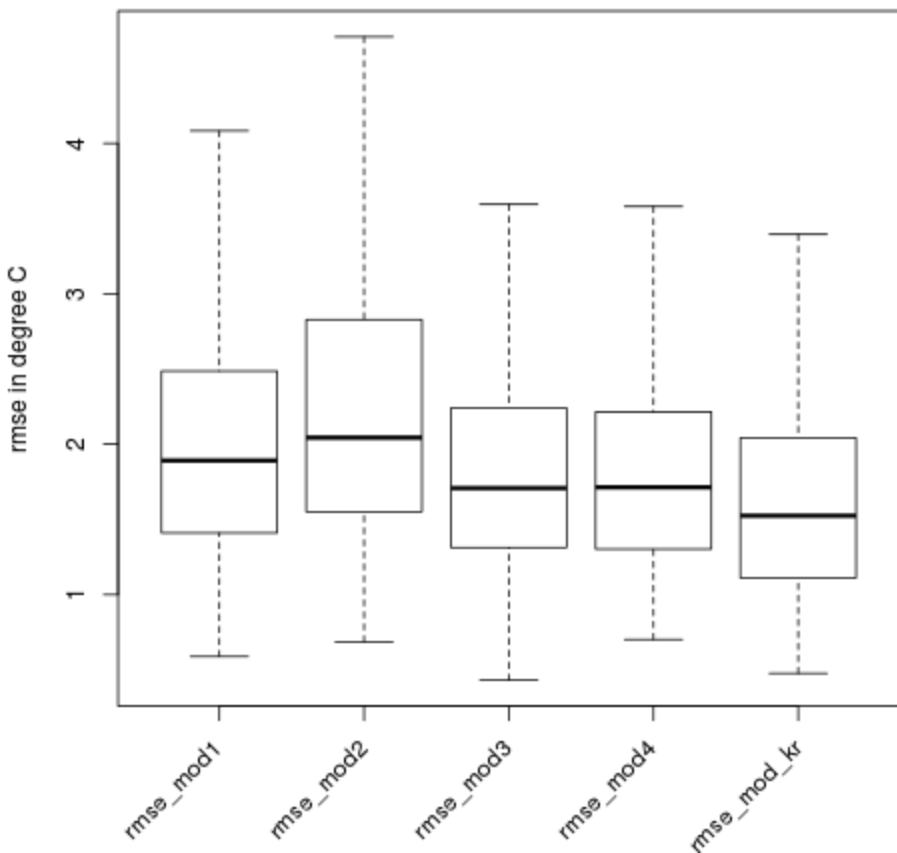
→ TMax monthly average created from stations within 1981-2010

→ Tmax predicted for year 2010

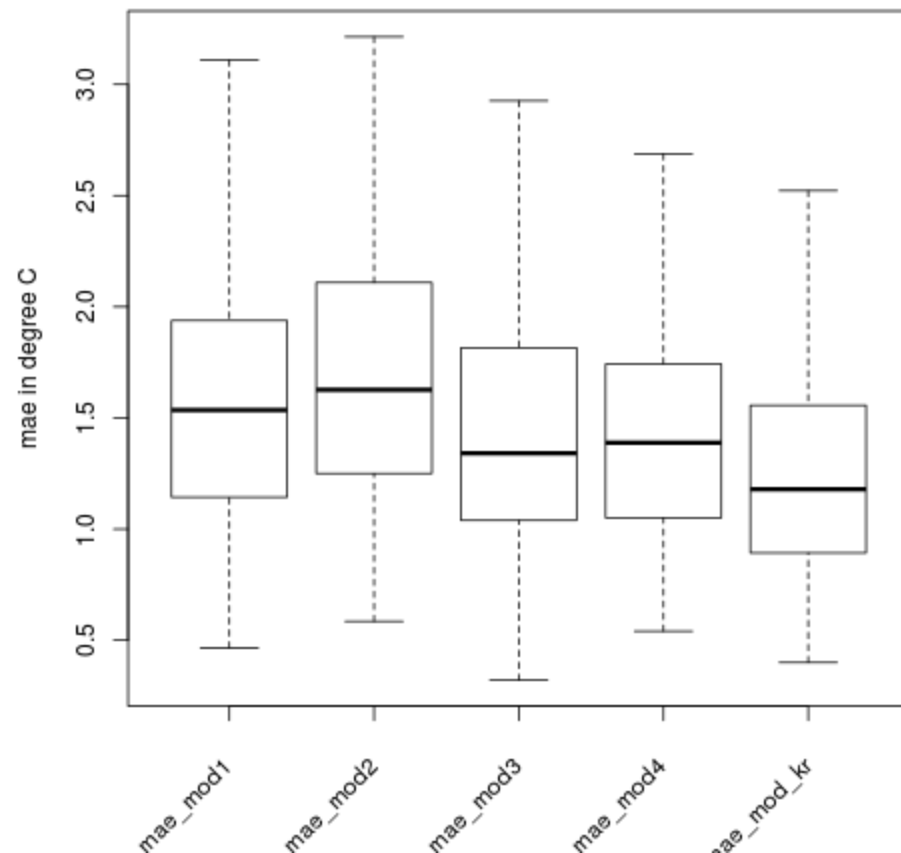
→ **First test run.**

TMAX CAI PREDICTION BOXPLOT: VENEZUELA

rmse for dailyTmax

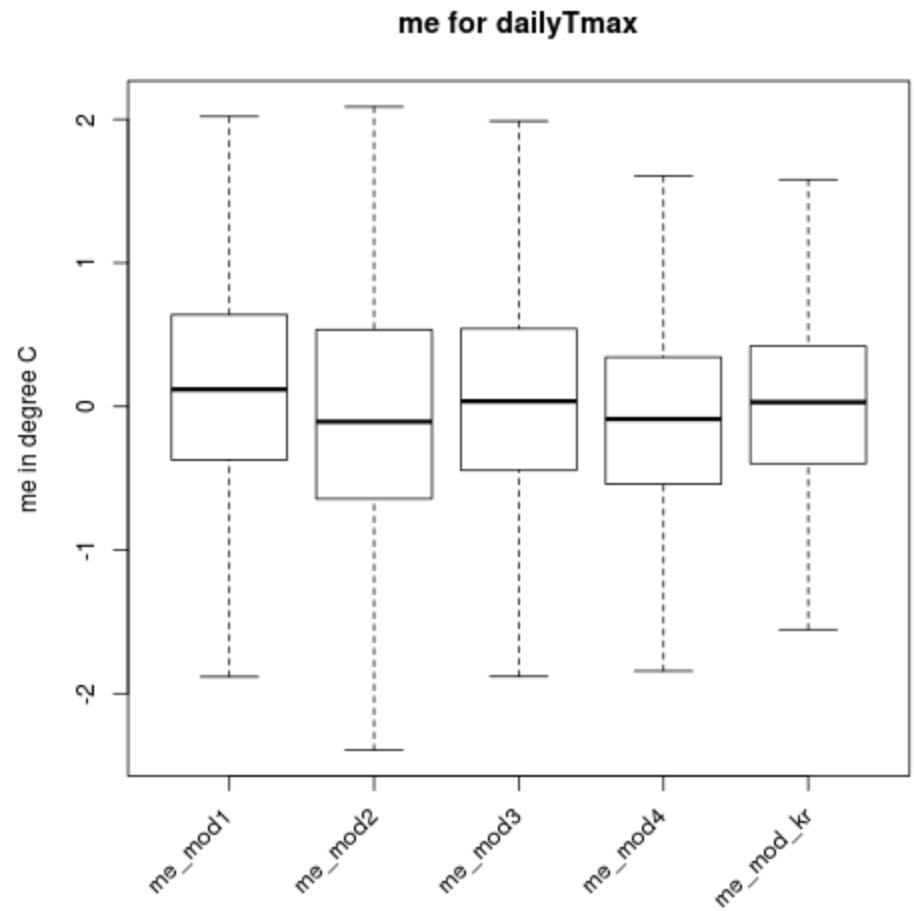
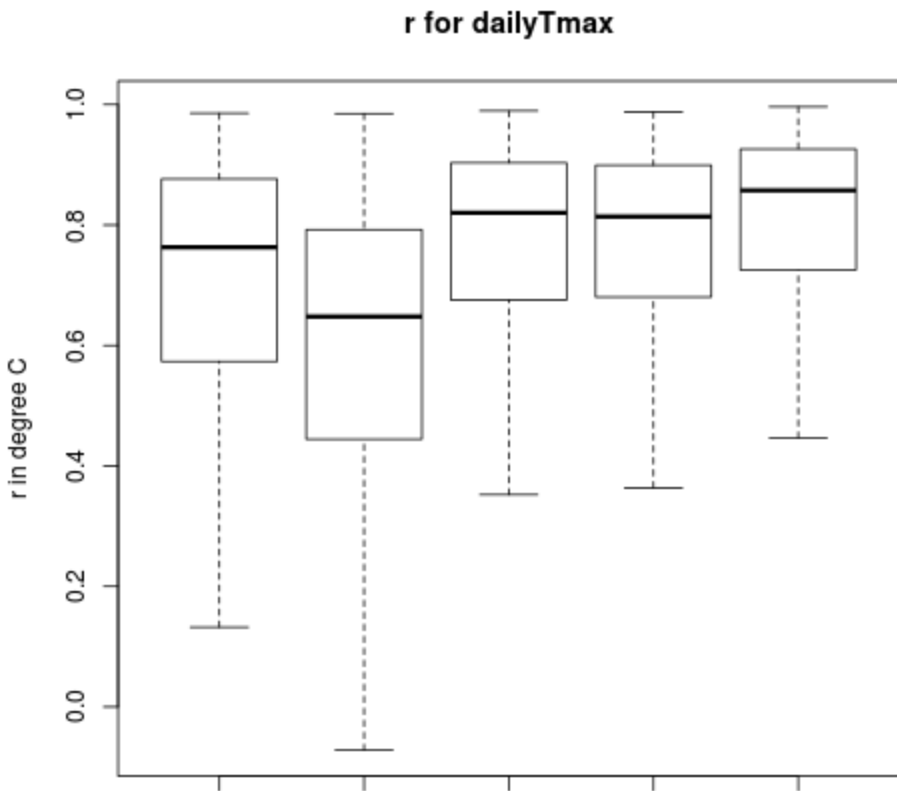


mae for dailyTmax



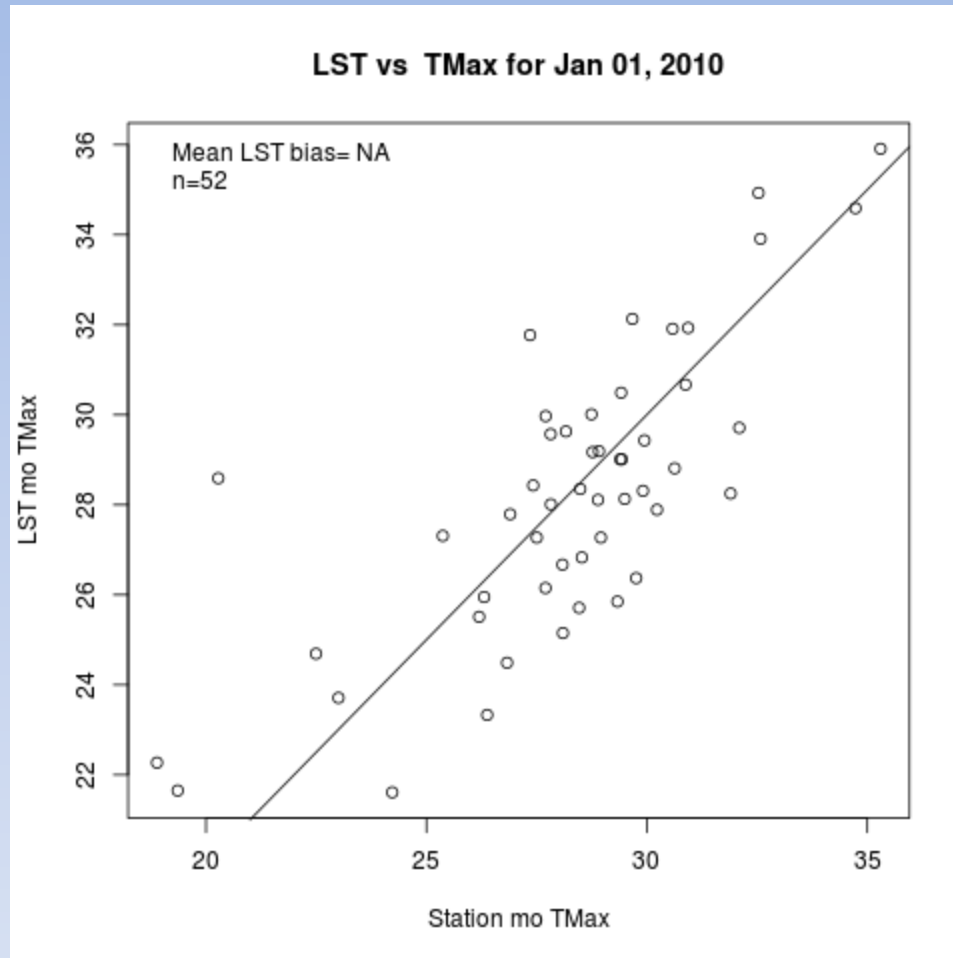
Accuracy metrics for all five model predicted

TMAX CAI PREDICTION BOXPLOT: VENEZUELA

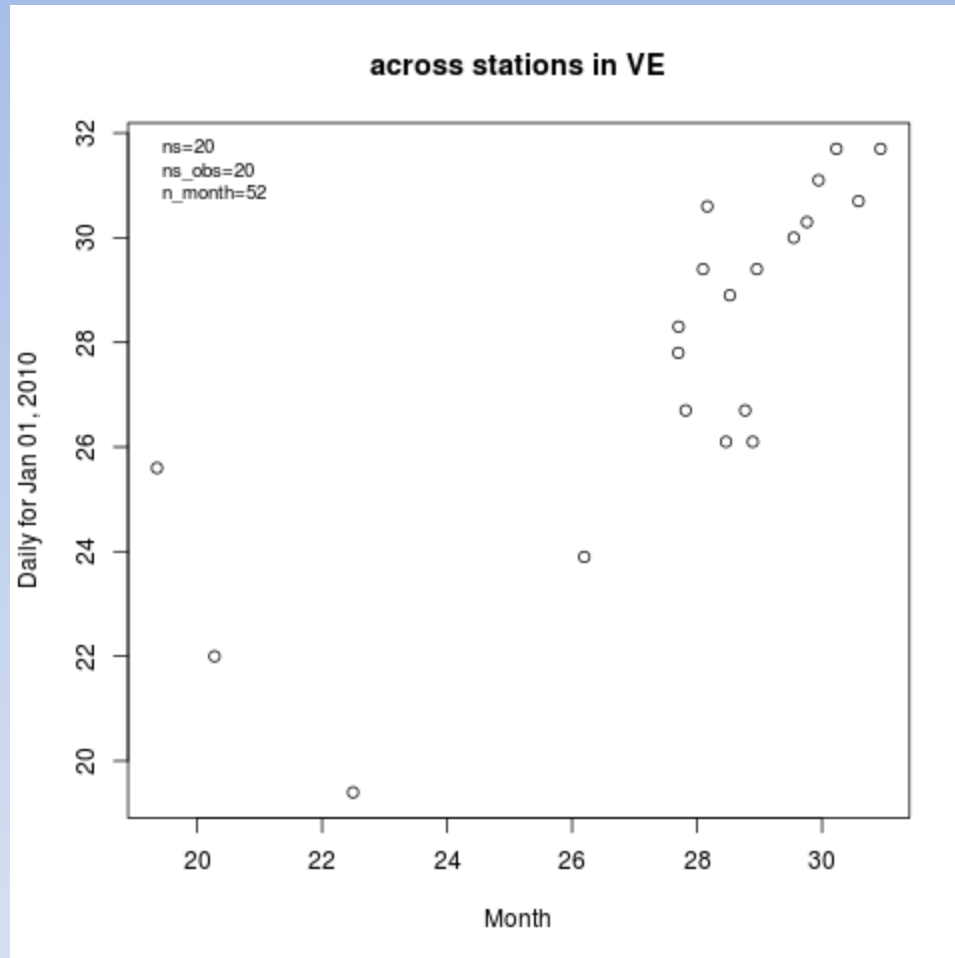


**Pearson Correlation coefficients
for all five predicted models**

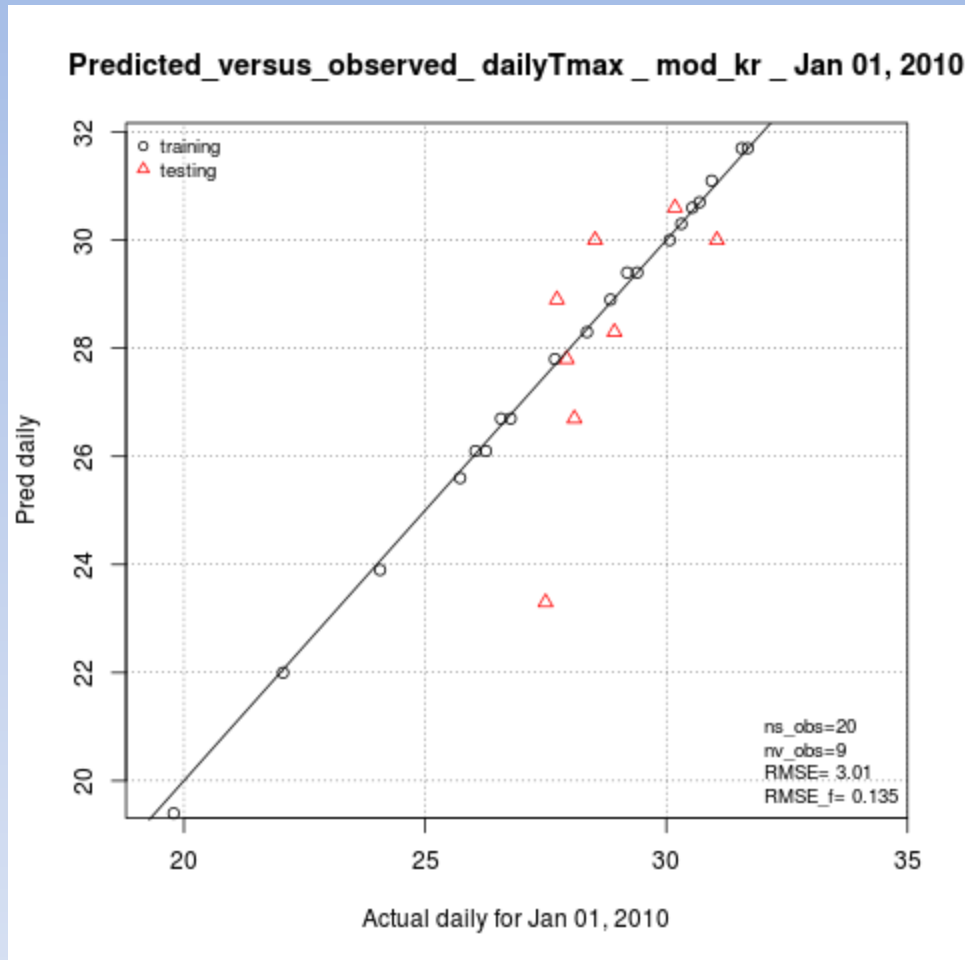
MONTHLY TMAX STATIONS VS MONTHLY MODIS LST



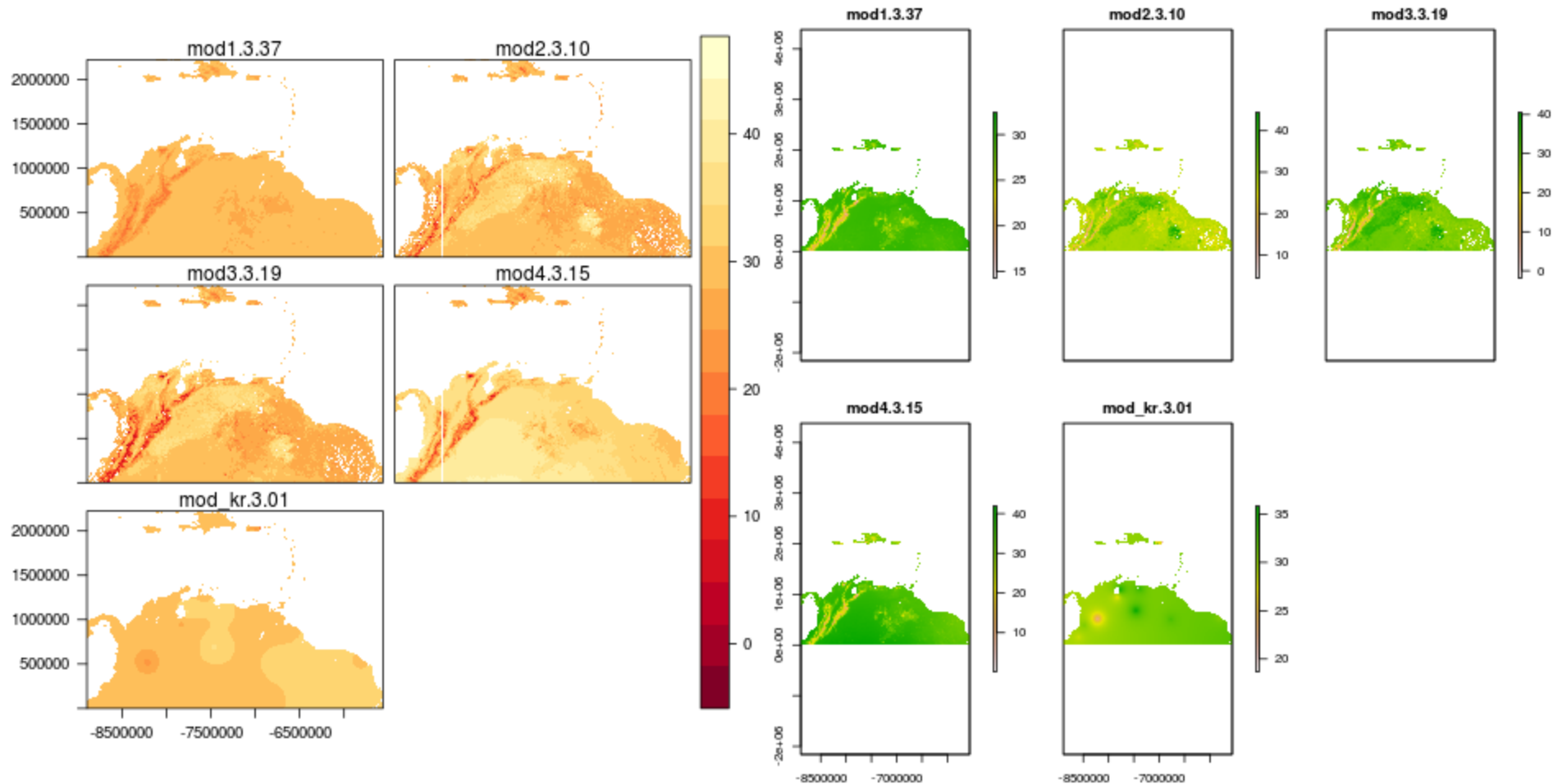
DAILY TMAX VS MONTHLY TMAX FROM STATIONS



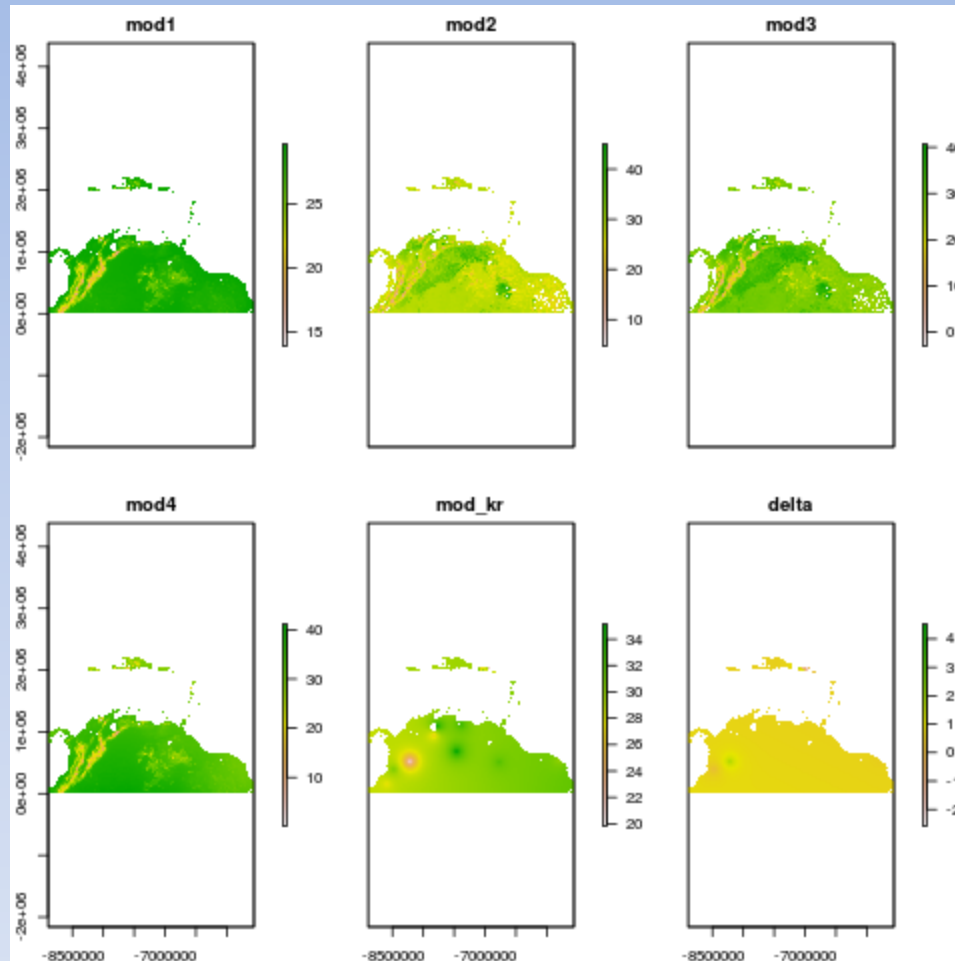
PREDICTED VS OBSERVED DAILY TMAX



CAI TMAX PREDICTED SURFACES ON JANUARY 1, 2010

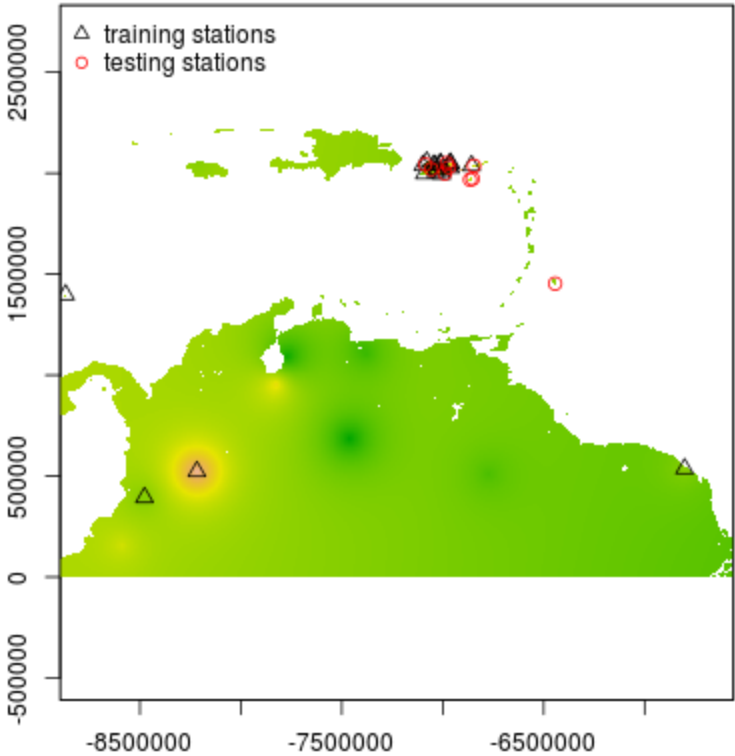
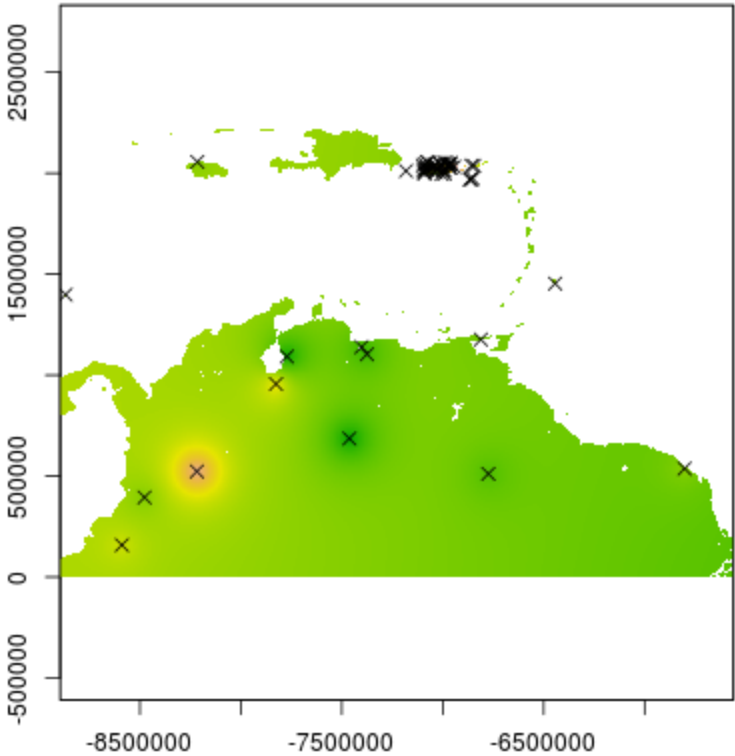


MODELED MONTHLY TMAX AND DAILY DEVIATION (CLIMATOLOGY AND DELTA SURFACES)



MAPS OF MONTHLY AND DAILY STATIONS USED IN THE PREDICTIONS

Monthly ghcn station in Venezuela for January



TMAX CAI PREDICTION BOXPLOT: VENEZUELA

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Browse[2]> summary_metrics_v
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$avg
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	pred_mod	mae	rmse	me	r	m50	run_samp	n
1	mod1	1.693040	2.218907	0.163463886	0.6638184	0.27240569	1	365
2	mod2	1.790911	2.414873	-0.046410445	0.5717142	-0.19600351	1	365
3	mod3	1.536335	2.023987	0.028467603	0.7373335	0.07481895	1	365
4	mod4	1.529399	2.039923	-0.094975809	0.7251565	-0.07783449	1	365
5	mod_kr	1.348965	1.826015	0.005717321	0.7713466	0.02577767	1	365

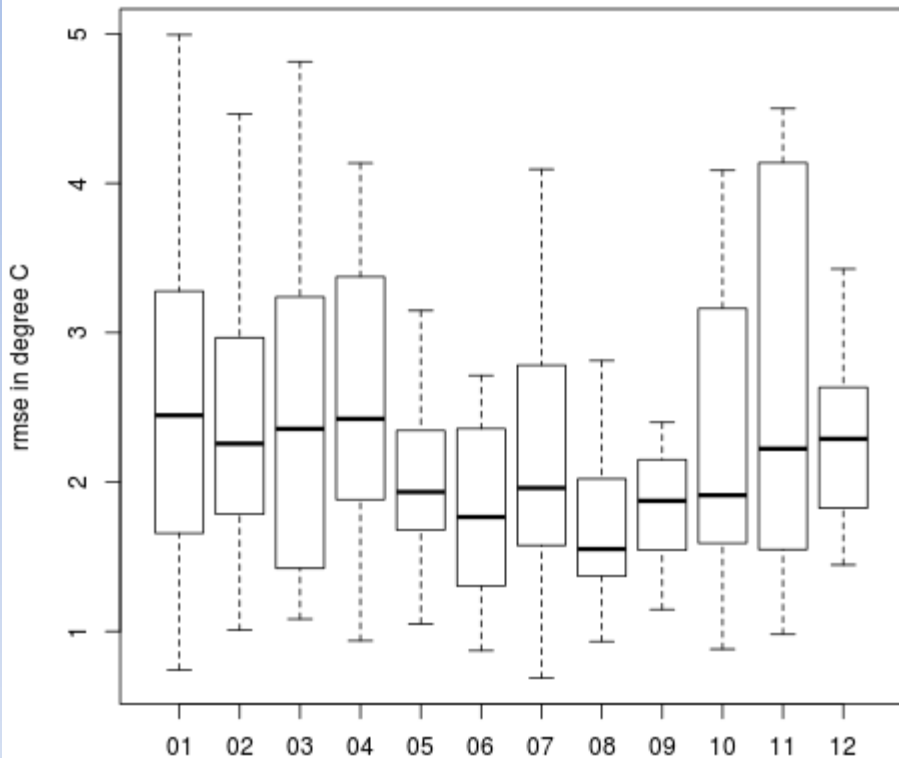
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$median
```

	pred_mod	mae	rmse	me	r	m50	run_samp	n
1	mod1	1.535136	1.891401	0.11865345	0.7629409	0.24932957	1	365
2	mod2	1.626323	2.043338	-0.10626732	0.6478757	-0.23366489	1	365
3	mod3	1.340923	1.708009	0.03647456	0.8202180	0.10159454	1	365
4	mod4	1.388337	1.713170	-0.08771027	0.8139545	-0.06717567	1	365
5	mod_kr	1.179028	1.524403	0.02974346	0.8574326	0.04742165	1	365

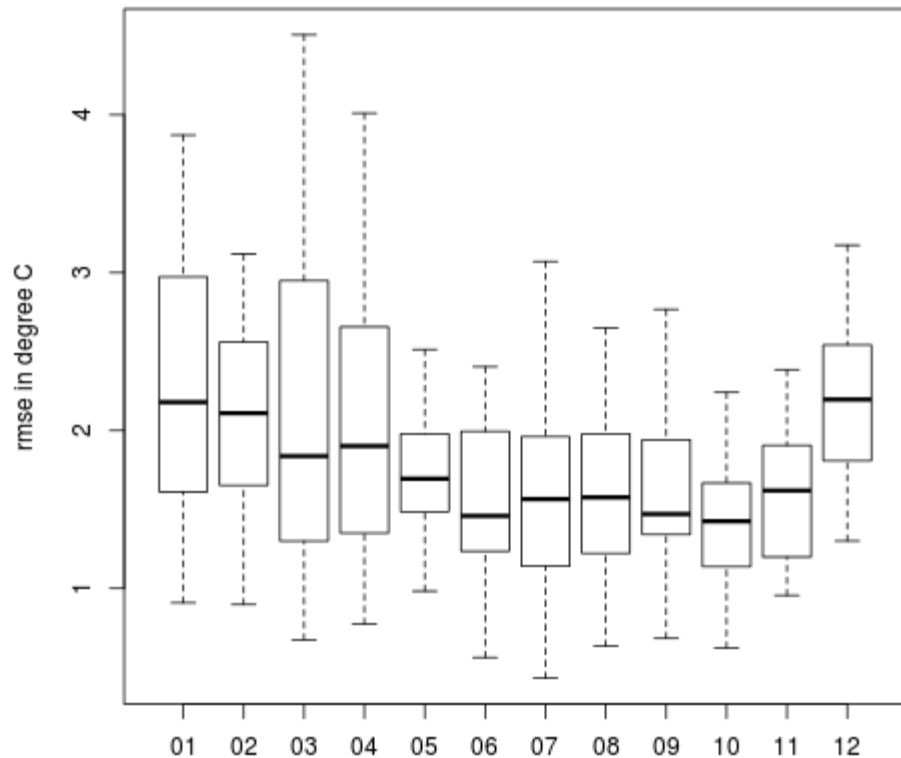
CAI mod_kr has the lowest RMSE and MAE but the spatial pattern predicted is very smooth as observed in the Oregon case study.

MONTHLY AVERAGE RMSE TMAX CAI PREDICTION BOXPLOT: VENEZUELA

rmse for mod2 by month



rmse for mod3 by month

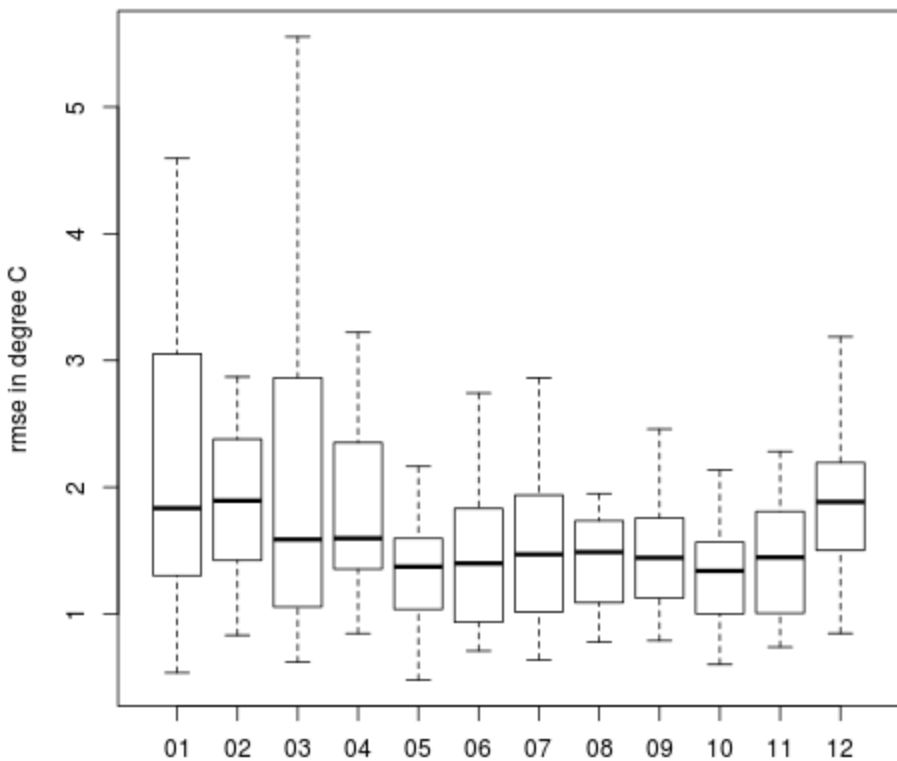


Mod2: $y_var \sim s(LST)$

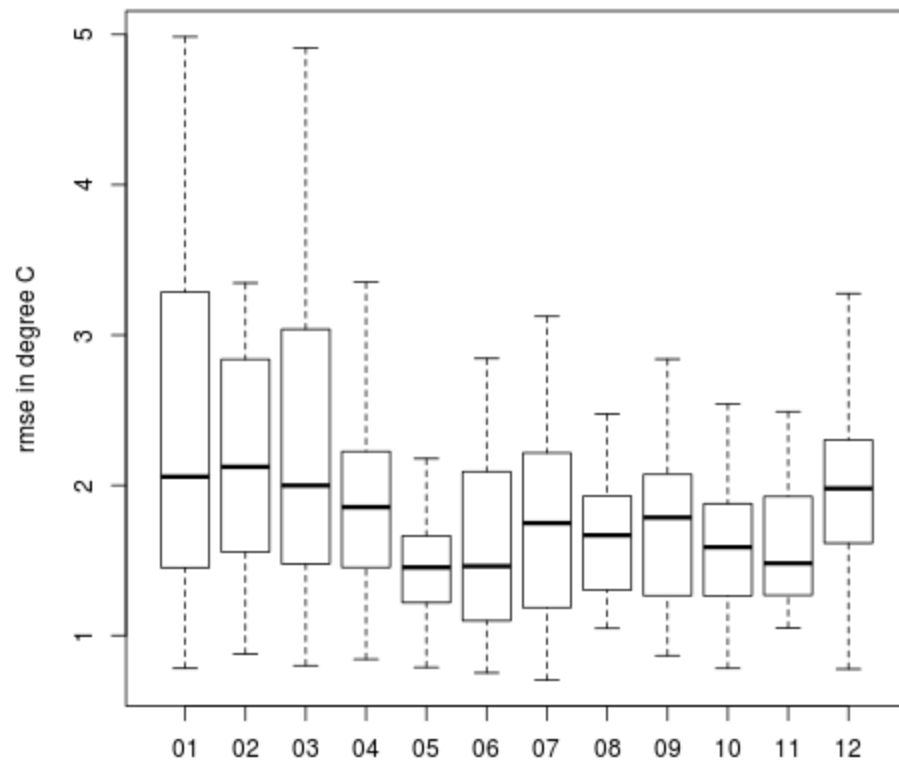
Mod3: $y_var \sim s(elev_s, LST)$

MONTHLY AVERAGE RMSE TMAX CAI PREDICTION BOXPLOT: VENEZUELA

rmse for mod_kr by month

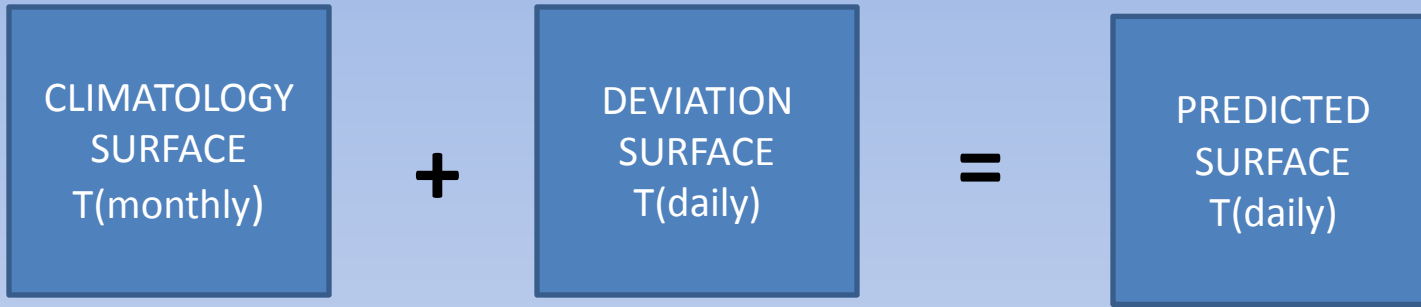


rmse for mod4 by month



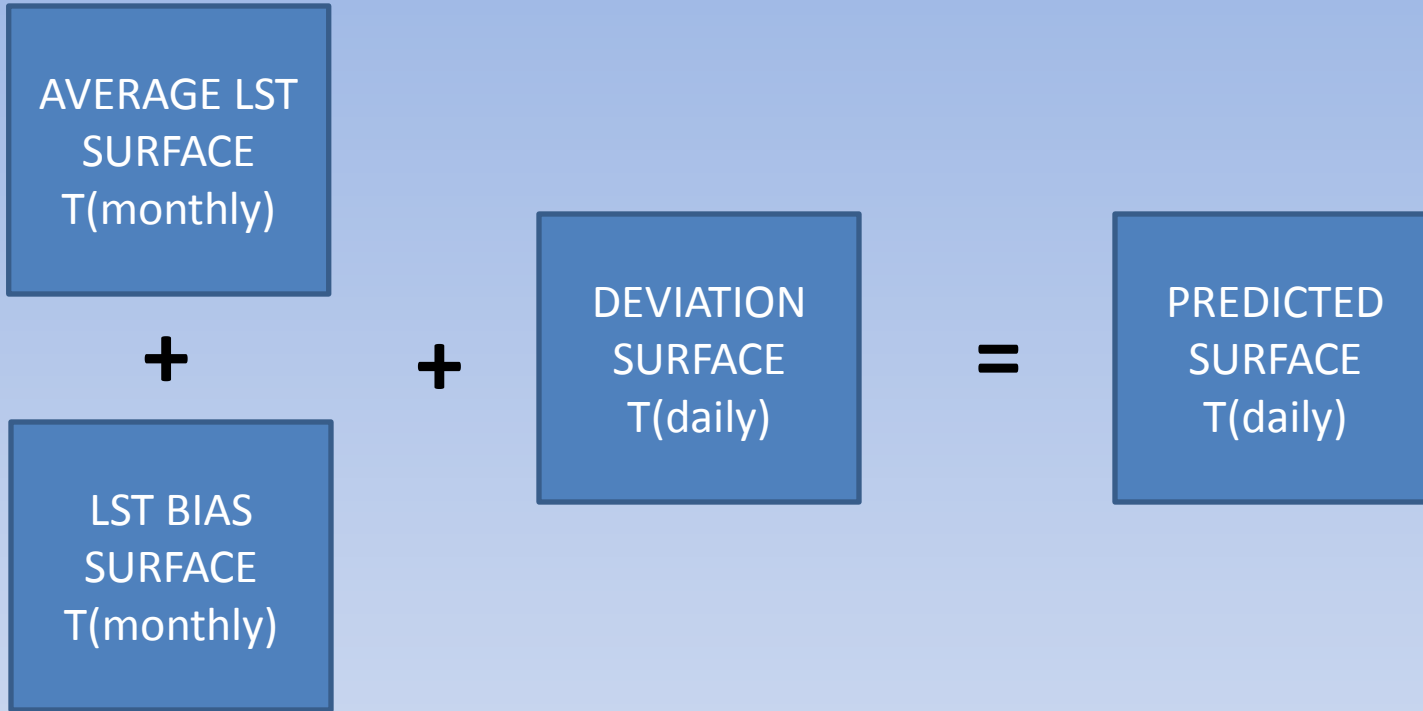
Mod4: $y_{var} \sim s(lat) + s(lon) + s(elev_s)$

CLIMATOLOGY AIDED INTERPOLATION



- The Climatology Aided Interpolation (CAI) method predicts temperatures by adding two surfaces: a climatology surface which represents a long term mean and; a deviation surface which represents the variation from the long term mean (Willmott 1995).
- CLIMATOLOGY SURFACE: generated from the monthly stations averages over 2000-2011. Average values are either kriged or modeled by GAM using covariates (model 1 to model 8).
- DEVIATION SURFACE : generated using the difference between monthly means and daily values at stations. It relates to weather. Deviations values are kriged to generate a continuous surfaces.

FUSION OF SATELLITE STATION



- The Fusion of Satellite Station (FSS) is a new method that incorporates satellite based information with station information.
- LST SURFACE: calculated for each month by averaging values for the 2001-2010 time period. LST averages correspond to long term means and provide spatial structure to the predictions.
- BIAS SURFACE: generated from the difference between monthly means at stations and LST monthly averages. Bias is either kriged or modeled by GAM using covariates (model 1 to model 8).
- DEVIATION SURFACE : generated using the difference between monthly means and daily values at stations. It relates to weather. Deviations values are kriged to generate a continuous surfaces.