

Agenda

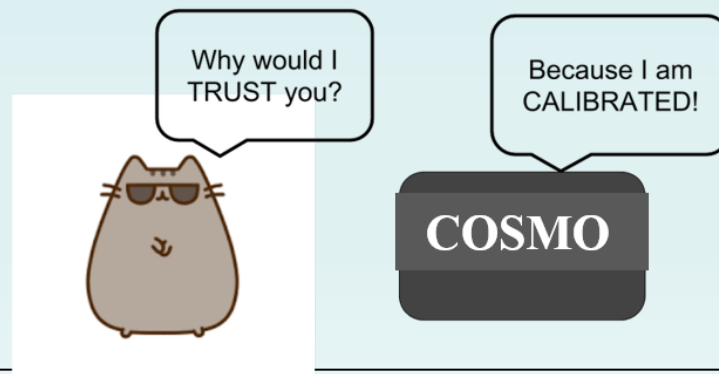
Monday morning (9h00-10h30, CALMO-MAX session, chair Antigoni Voudouri)

- 09:00-09:30 Final review of CALMO project (A. Voudouri)
- 09:30-10:00 On the Domain Sensitivity of COSMO Model over the Mediterranean Area (E. Avgoustoglou)
- 10:00-10:30 On the Meta-Model (I. Carmona)
- 10:30-11:00 Coffee break
- 11:00-12:30 Open discussion: review of CALMO-MAX plan, resources, future workshop, list of scientific questions (All)

CALMO

Calibration of COSMO model

- Aim of the project
 - Provide an objective methodology for COSMO to substitute expert tuning and
 - Establish a standard procedure (tool) that objectively improves model performance by determining optimum values of the unconfined parameters.
- Project status: Finished (Work completed in 3 phases 01.2013 – 12.2016)
- FTEs invested: 6.5
- Project Team : A. Voudouri, P. Khain, I. Carmona, E. Avgoustoglou, J.-M. Bettems, F. Grazzini, and O. Bellprat

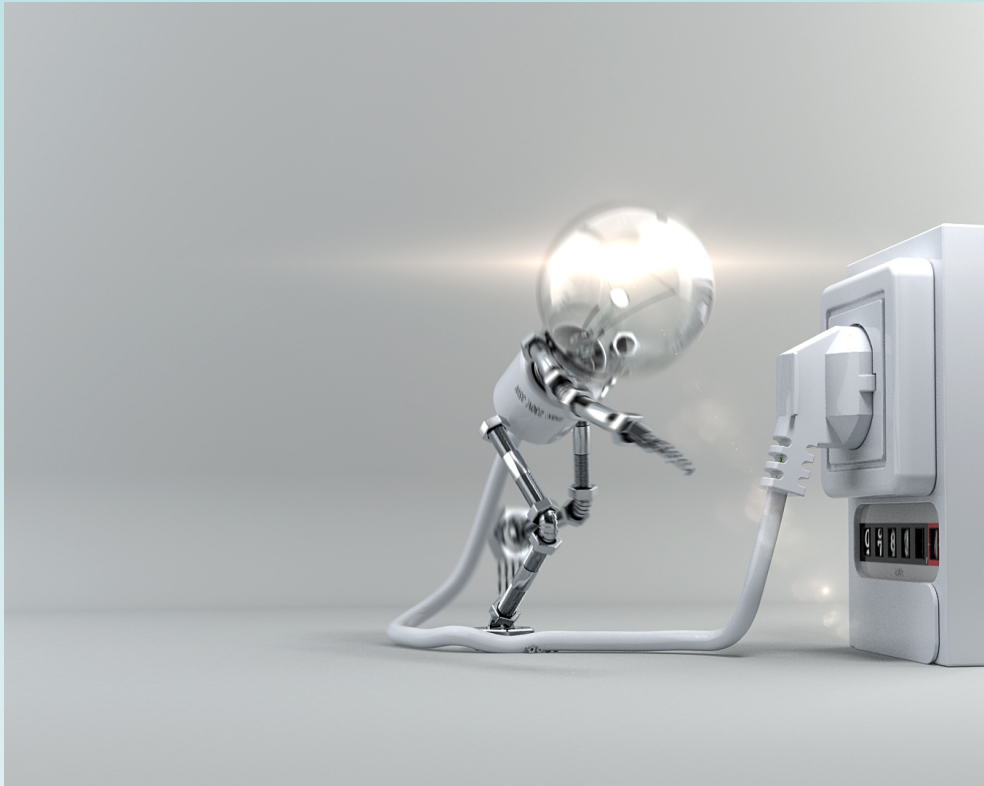


CALMO – The problem



- NWP and climate models use parameterization schemes for physical processes which often include free or poorly confined parameters.
- Model developers normally calibrate the values of these parameters subjectively to improve the agreement of forecasts with available observations, a procedure referred as expert tuning.
- Expert tuning sometimes referred to as *bad empiricism* **lacks objectivity** and requires **significant computer resources**.

CALMO – The idea



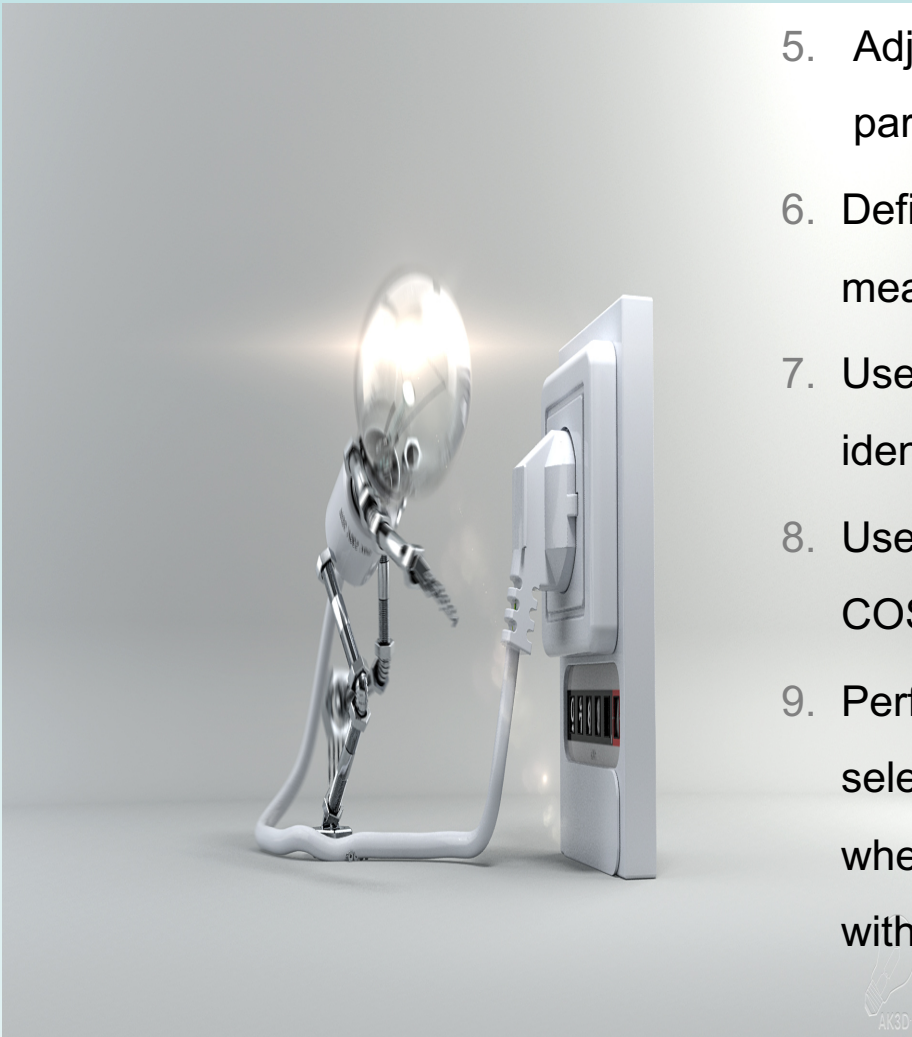
- The idea to overcome the problem of both replace ‘expert tuning’ and reduce computational costs is to construct a statistical surrogate model, also termed model emulator
- Bellprat et al. 2012 used the work of Neelin et al. 2010 on building a quadratic metamodel that serves as a computationally **cheap emulator of the model (meta-model MM)**
- The methodology was applied to objectively calibrate COSMO-CLM and reduced the model error of an expert tuned model by about 10%

CALMO methodology-How to..... (1)



1. Selection of important **model parameters** for calibration
 - Exact value is not well known
 - Model performance is sensitive to the choice of the value (check)
2. Selection of model variables with appropriate observations to be used for validation .
3. Define the method to perform the COSMO simulations time, i.e. initial and boundary conditions and the forecasts time ranges. For soil-related parameters, long term “spin-up” simulations of the COSMO soil scheme are needed for preparing proper initial conditions.
4. Decide on the number of parameters (N) and perform $2N + 0.5N(N - 1) + 1$ simulations of calibrated parameters.

CALMO methodology-How to..... (2)



5. Adjust the **meta-model** applicable to parameter variations
6. Define an objective **performance function** to measure model quality
7. Use MM to sample the parameter space to identify **optimal parameter configurations**.
8. Use optimal parameters configuration to run COSMO model.
9. Perform a real COSMO simulation with the selected parameters combination to verify whether the forecasts are indeed better (than with the default parameters combination).

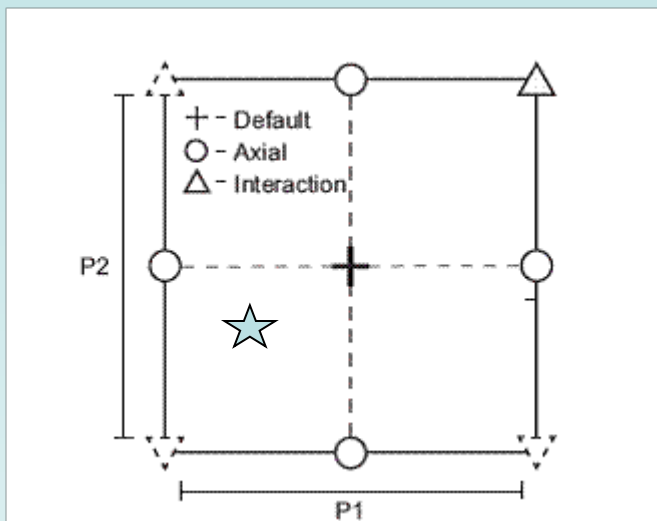
Define sensitivities

$$S_{<P>}(\%) = \frac{<P>_{TEST} - <P>_{DEFAULT}}{<P>_{DEFAULT}} \bullet 100$$

$<P>$ stands for $<SNOWGSP>$ or $<TOTPREC>$ or $<CLCL>$ or $<CLCM>$ or $<CLCH>$ or $<CLCT>$

$$S_{\begin{bmatrix} TMIN2m \\ TMAX2m \end{bmatrix}} = \begin{bmatrix} <TMIN2m> \\ <TMAX2m> \end{bmatrix}_{TEST} - \begin{bmatrix} <TMIN2m> \\ <TMAX2m> \end{bmatrix}_{DEFAULT}$$

Number of simulations required Experimental design



$$2N + N(N-1)/2 + 1 \text{ default}$$

	c_soil_min	c_soil_max	v0_sn_min	v0_sn_max	crsmin_min	crsmin_max	entr_min	entr_max	tkhm_min	tkhm_max	tur_l_min	tur_l_max	rlam_h_min	rlam_h_max
c_soil_min			14	2	1	16	13	3	26	35		25	27	34
c_soil_max			5	19	21	10	4	20	41	29		39	40	32
v0_sn_min					6	18	15	7						
v0_sn_max					22	11	8	23						
crsmin_min							9	24	45	44				47
crsmin_max							17	12	43	46				48
entr_min														
entr_max														
tkhm_min												38	42	33
tkhm_max												28	30	36
tur_l_min														
tur_l_max													37	31
rlam_h_min														
rlam_h_max														

Construction of the MM

COSMO forecasted field $F_{i,r}$ for a specific region r and day i may be approximated by N-dimensional polynomial

$$F_{i,r} \cong F_{i,r}^d + c_{i,r} + \sum_{n=1}^N a_{i,r}^{(n)} x_n + \sum_{n=1}^N \sum_{m=1}^N B_{i,r}^{(n,m)} x_n x_m$$

where N the number of parameters $p_1, p_2, p_3, \dots, p_N$ used

$$x_m = \frac{p_m - p_{def}}{p_{max} - p_{min}} \quad \text{and} \quad x_n = \frac{p_n - p_{def}}{p_{max} - p_{min}}$$

and x_m, x_n the normalized parameters

Description of the performance score

$$S_{COSI-p} = \frac{1}{N_m \sum_{\Psi=1}^{N_\Psi} \omega_\Psi} \left\{ \sum_{\Psi=1}^{N_\Psi} \omega_\Psi \sum_{m=1}^{N_m} \left[1 - \frac{\sum_{r=1}^{N_r} \sum_{d_m=1}^{N_{d_m}} \left(F_{p,\Psi,\Psi,m,d_m} - O_{\Psi,r,m,d_m} \right)^2}{\sum_{r=1}^{N_r} \sum_{d_m=1}^{N_{d_m}} \left(O_{\Psi,r,m,d_m-1} - O_{\Psi,r,m,d_m} \right)^2} \right] + \omega_3 \frac{\sum_{m=1}^{N_m} \sum_{r=1}^{N_r} \sum_{t=1}^{N_t} ETS_{p,r,m,t}}{N_m N_r} \right\}$$

Ψ, r, m, d_m refer to field, region, month and day of month m while N_Ψ, N_r, N_m , refer to their upper limit numbers of 21, 6, 12, respectively, and N_{dm} takes the values 31, 30 and 28 depending on the month. Index p denotes the values of the corresponding specific parameter combination.

ω_Ψ

$ETS_{p,r,m,t}$ for a particular parameter combination p , region r , month m and threshold index t

$$ETS_{p,r,m,t} = \frac{H - \frac{(H+F)(H+M)}{N_r N_m}}{H + M + F - \frac{(H+F)(H+M)}{N_r N_m}}$$

H refers to the number of *hits*

F to the number of “*false alarms*”

M to the number of *misses*

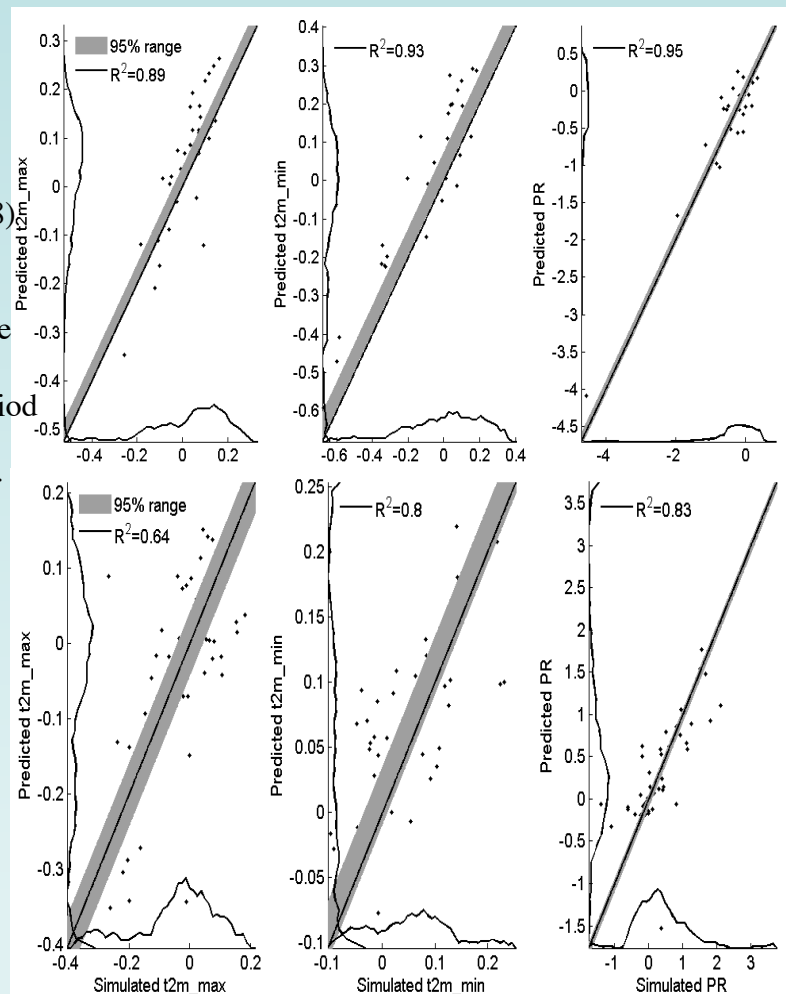
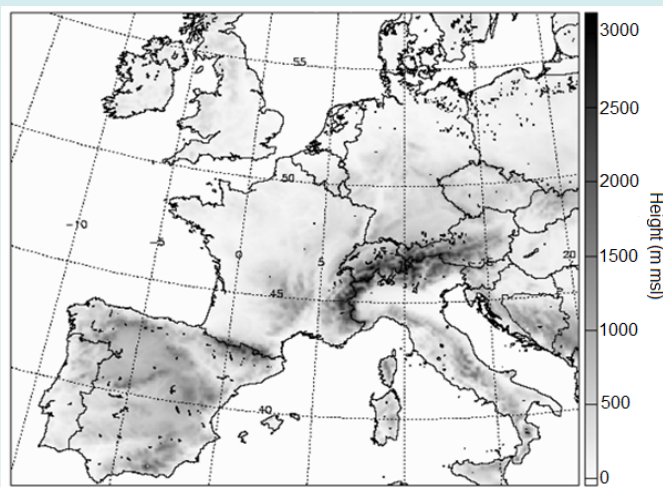
PP CALMO –Phase 1 results

Phase-1 finished within COSMO year 2014-15

- 3 parameters (tur_len, tkhmin and rlam_heat)
- 3 variables : maximum daily temperature (Tmax), minimum daily temperature (Tmin) and 24 hours accumulated precipitation (Pr)
- two 3-weeks periods winter (3-20/1/2008) and summer (2-20/6/2008)
- COSMO-7km, large domain (figure below)

Phase-1 results

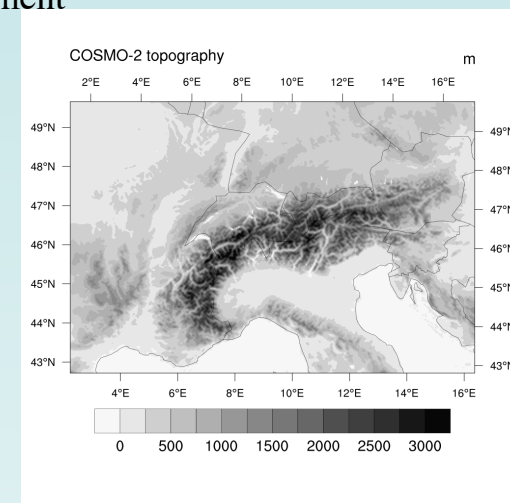
- The MM is capable in reproducing COSMO-NWP, thus the objective methodology can be transferred from RCM to NWP
- The best correlations 95% and 93% are calculated during winter period for 24 hours accumulated precipitation and minimum 2m temperature respectively, while also for maximum temperature correlation is better 89% during winter against 64% for summer (figure on the right)
- A different set of optimum parameter values for each season was extracted



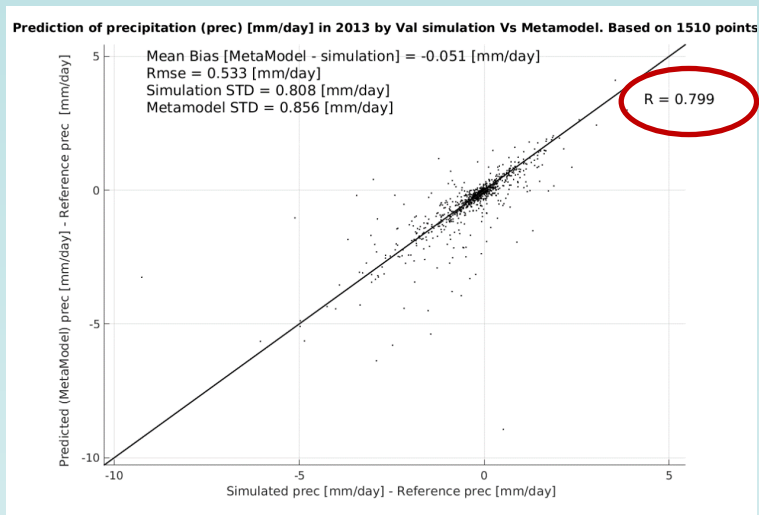
Tmax (left panel), Tmin (centered panel) and precipitation (right panel) for the period 3-20.1.2008 (upper) and 2-20.6.2008 (lower panel)

Phase-2 finished within COSMO year 2015-16

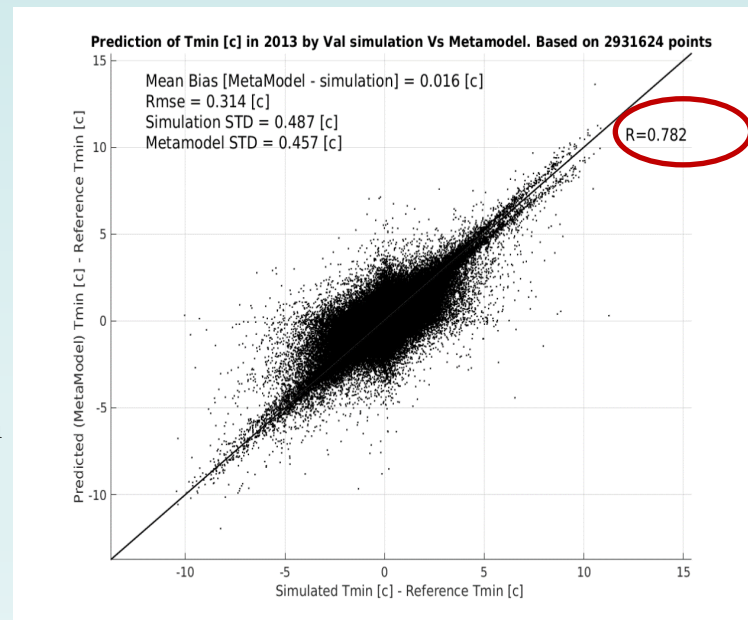
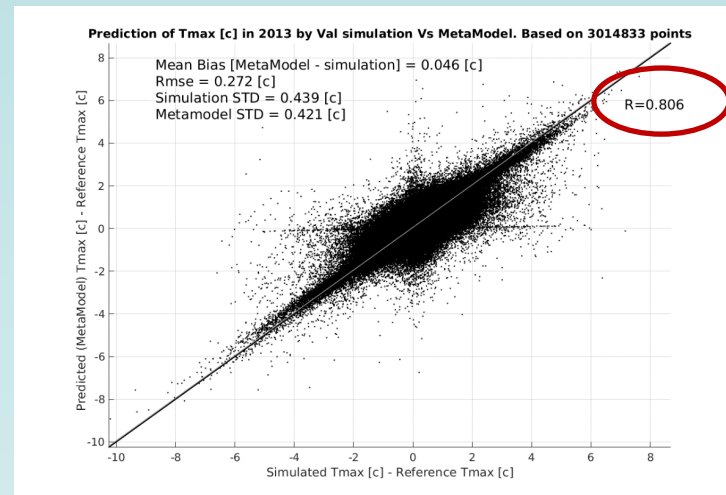
- Simulations using COSMO with a 2.2 km mesh size
- The simulation period was significantly increased from 40 days of 2008 to the entire year of 2013 using Piz Daint resources
- The number of calibrated parameters has been increased from 3 to 6 , namely `rlam_heat`, `tkhmin`, `tur_len`, `entr_sc`, `v0snow`, and `c_soil`
- The history of the soil was not used the configuration of this calibration experiment
- Set of **model fields** used in quality score:
 - Daily min and max of **T2m** (grid points, CH and Northern Italy)
 - Daily accumulated **precipitation** (regions, CH and Northern Italy)
 - Total column **water vapor** (11 sounding)
 - **Wind shear** 500-700 / 700-850 / 850-1000 hPa (11 soundings)
 - **U, V, T** and **RH** at 500, 700 and 850 hPa (11 soundings)
- MM has been consolidated and extended by
 - adding the option not to average Tmax/Tmin over regions
 - adding the prediction of multiple vertical profile characteristics, and
 - supporting new geographical regions.
 - include a a COSMO standard performance score, a new COSI performance score
 - develop a new method for logarithmic transformation of selected parameters



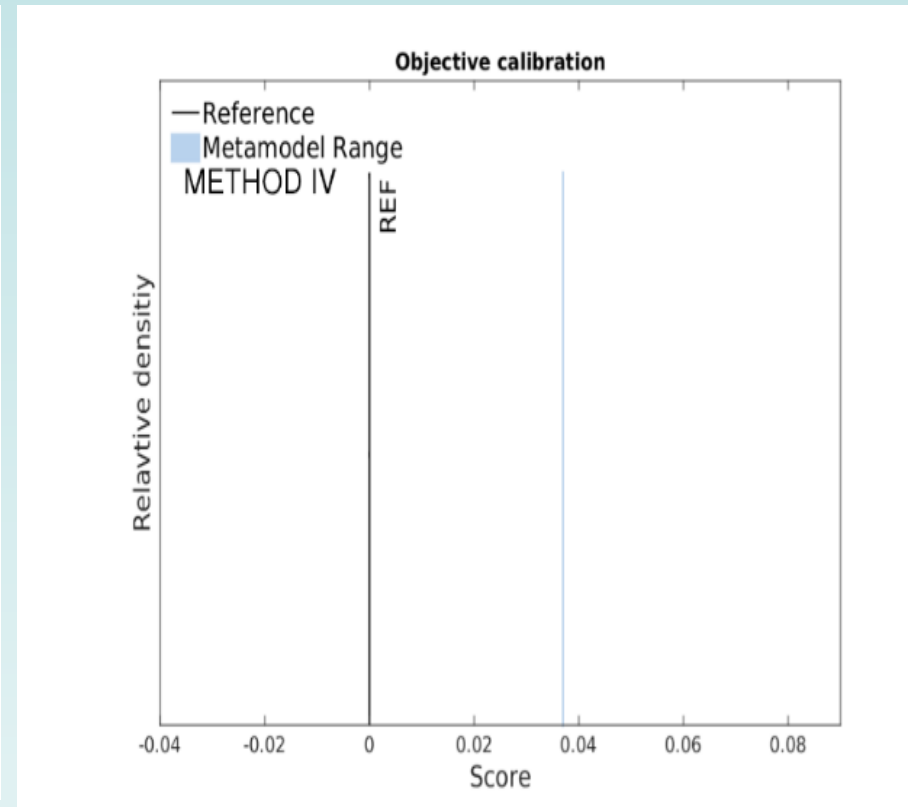
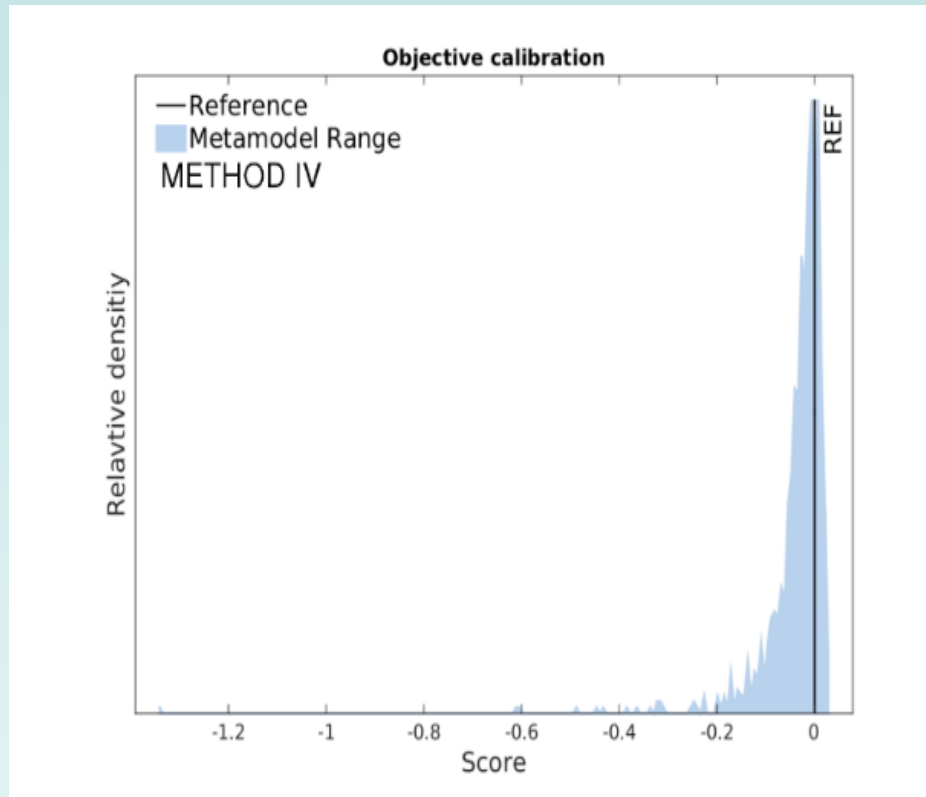
PP CALMO – Phase 2 results



- An optimal parameters combination was obtained and the verification showed an overall improvement of the COSMO model, although the model had already undergone expert tuning over a period of almost one decade.
- The MM is capable in accurately reproducing COSMO-NWP over an entire year
- The correlations calculated during simulation period for 24 hours accumulated precipitation maximum and minimum 2m temperature are 79.9%, 80.6% and 78.2% respectively (figure on the right)

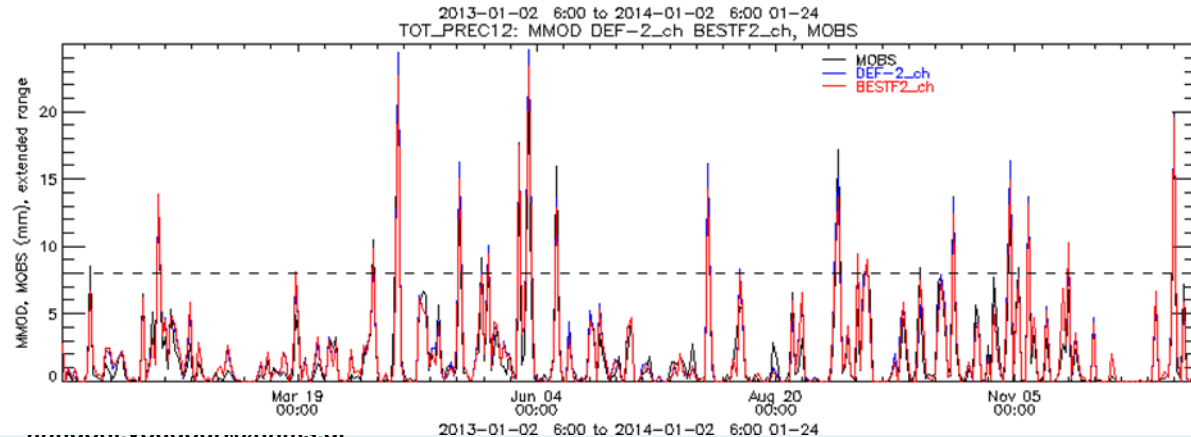
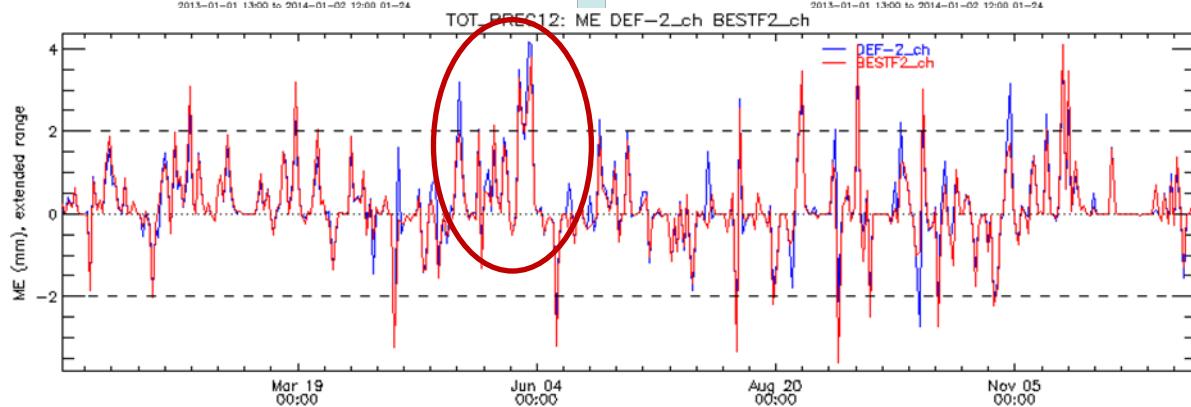
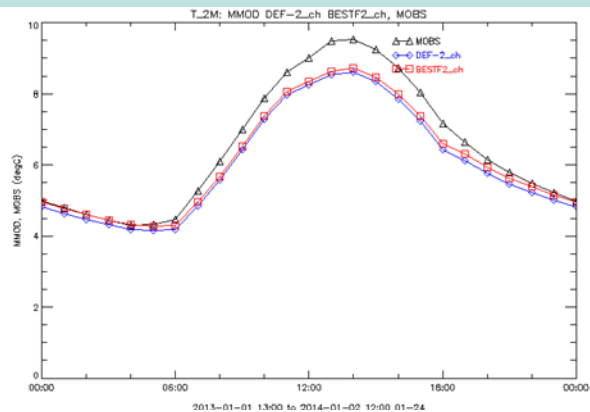
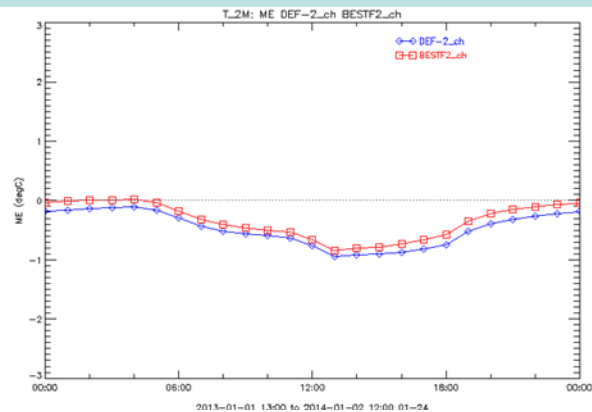


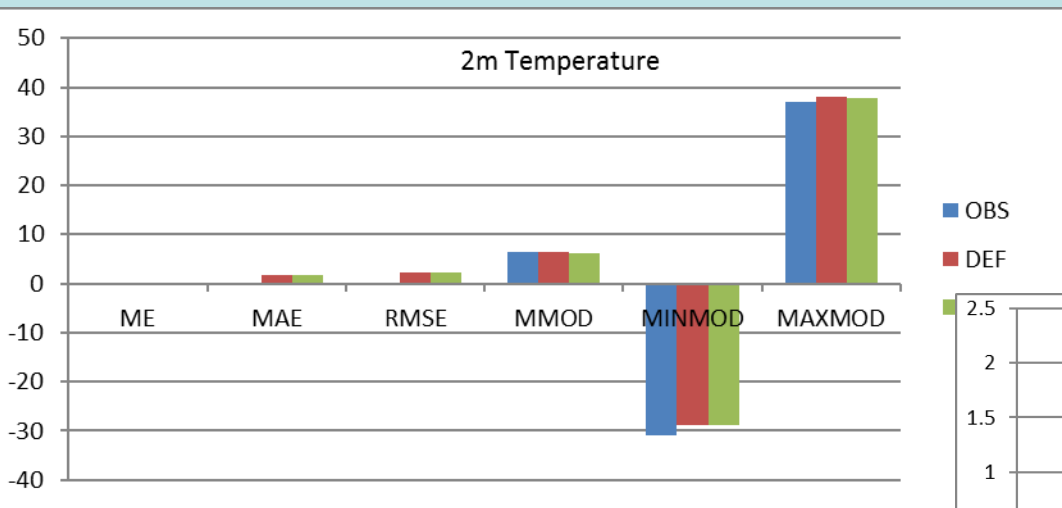
PP CALMO – Phase 2 results



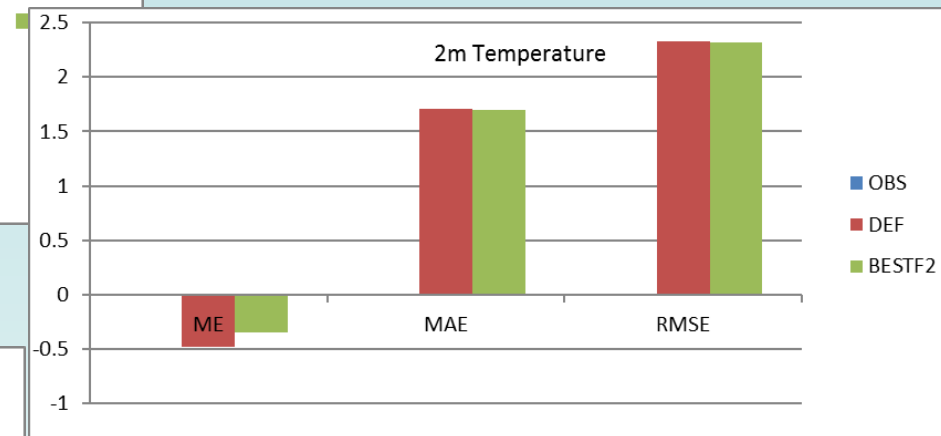
Scores distributions after **first** iteration (left) and **last** iteration (right), together with the scores of the reference (REF) simulation for COSMO 2.2km

Parameter	Acronym	Default values	Optimum value (after method 4)
Factor for laminar resistance for heat	rlam_heat	1 (20 rat_sea) (0.1-2)	1.273 (15.71092) Uncertainty: [1.149 1.390]
Minimal diffusion coefficient for heat	tkhmin	0.4 (0.1-1)	0.266 Uncertainty: [0.205 0.351]
Maximal turbulent length scale (m)	tur_len	150 (100-1000)	346.5 Uncertainty: [294.6 409.9];
Entrainment rate for shallow convection	entr_sc	0.3e-3 (0.05e-3, 2e-3)	0.1607e-3 Uncertainty: [0.1261e-3 0.2104e-3];
Surface-area index of the evaporating fraction of grid points over land.	csoil	1 (0-2)	0.588 Uncertainty: [0.515 0.664];
Factor for vertical velocity of snow	v0snow	20 (10-30)	12.3 Uncertainty: [11.6 13.3]

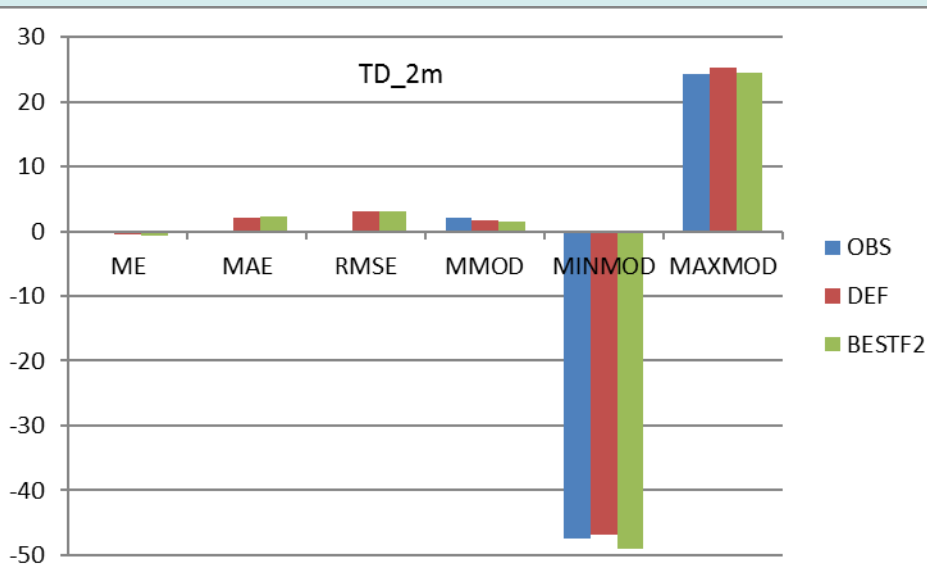




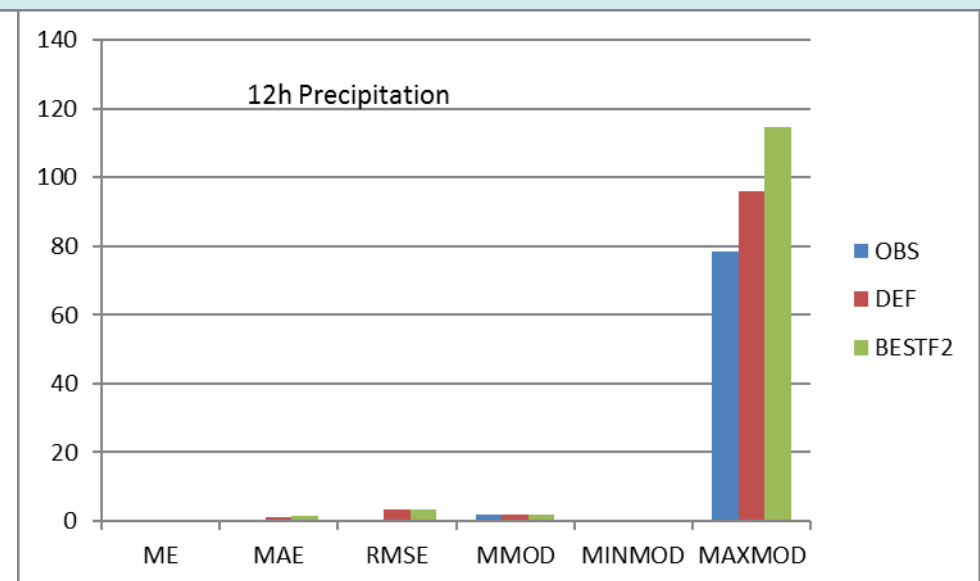
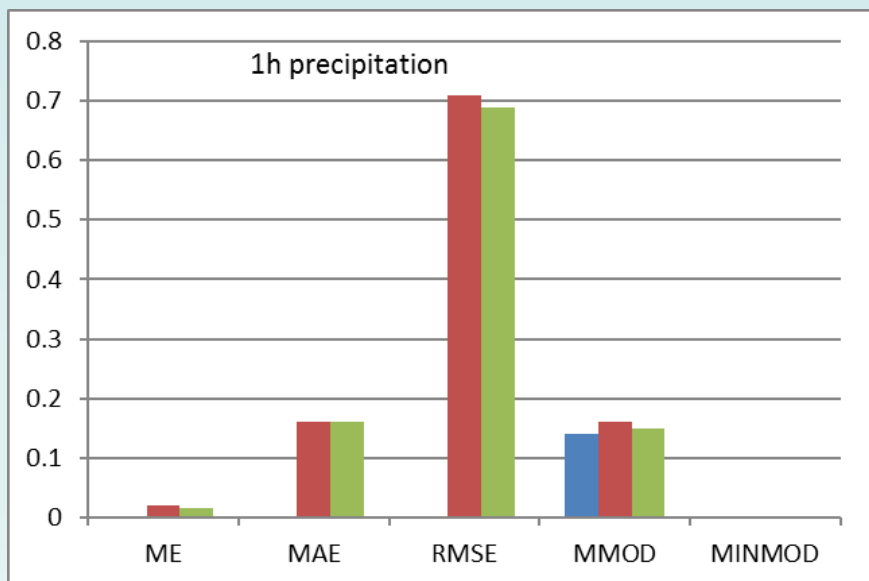
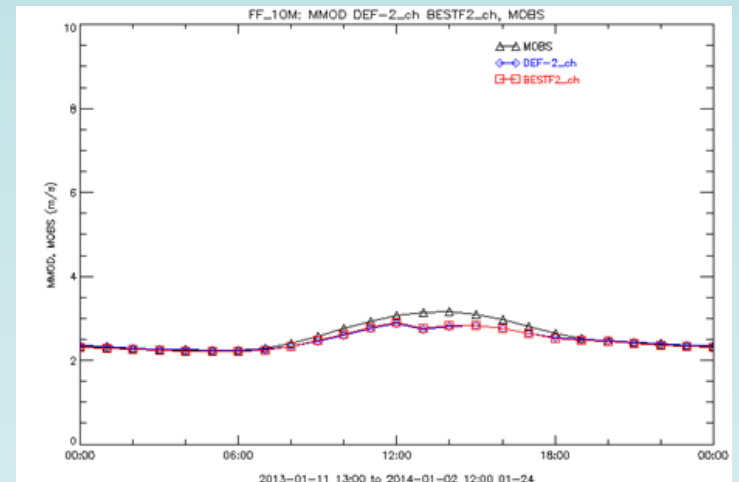
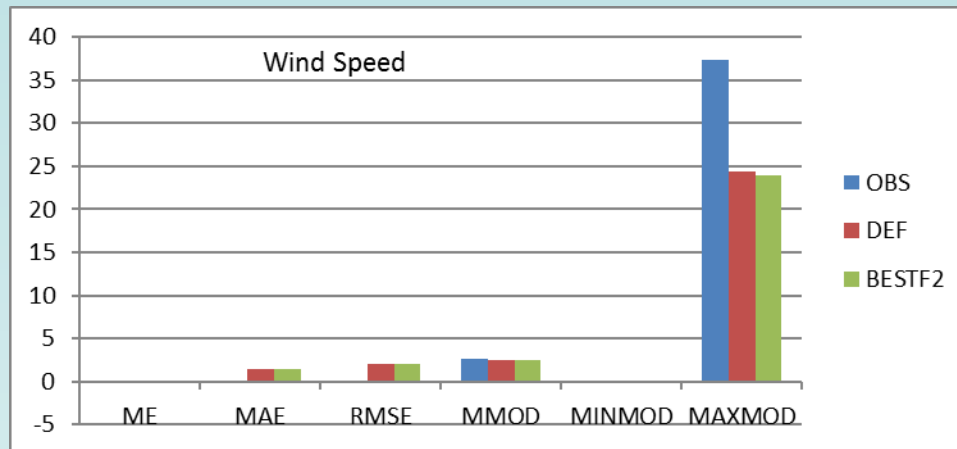
■ OBS
■ DEF



■ OBS
■ DEF
■ BESTF2



■ OBS
■ DEF
■ BESTF2



COSMO-1

5 free parameters used for calibration

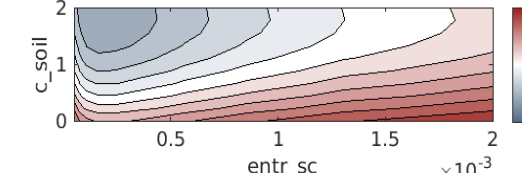
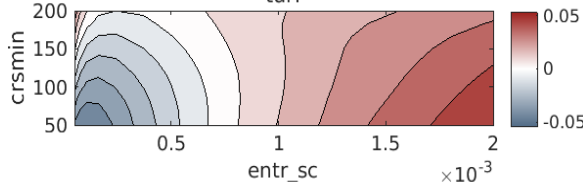
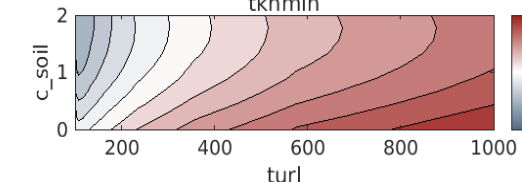
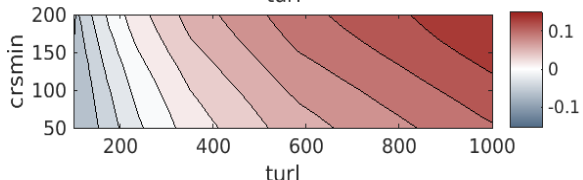
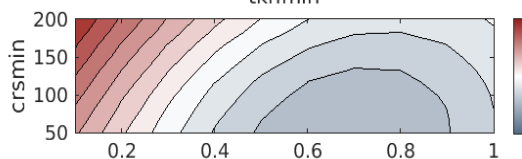
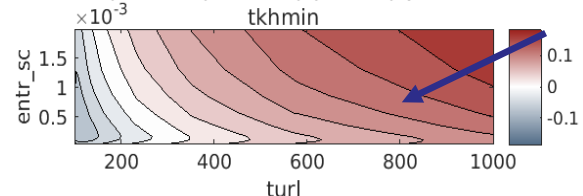
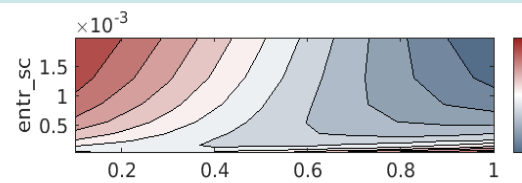
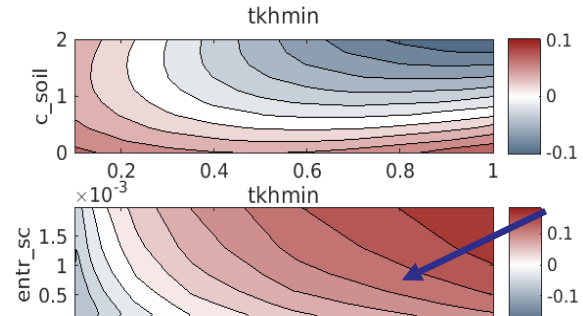
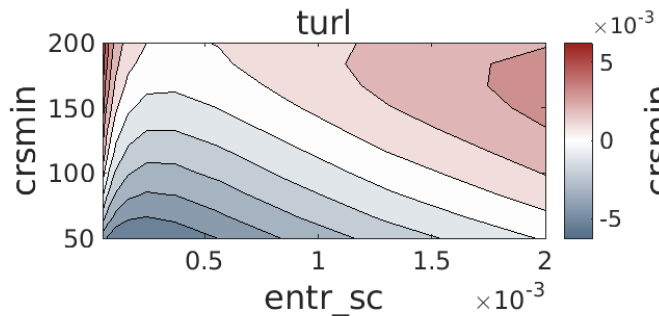
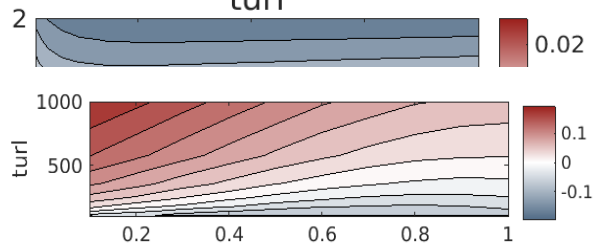
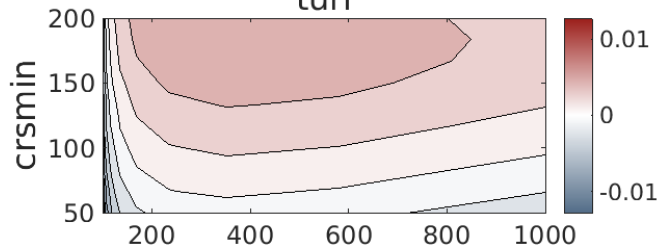
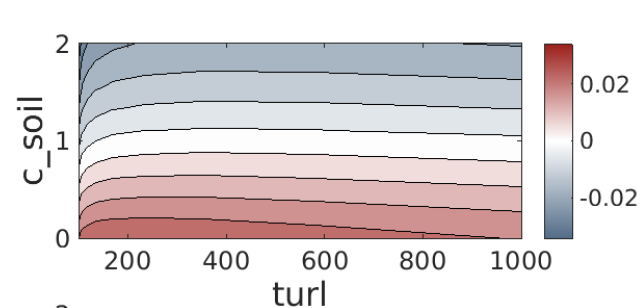
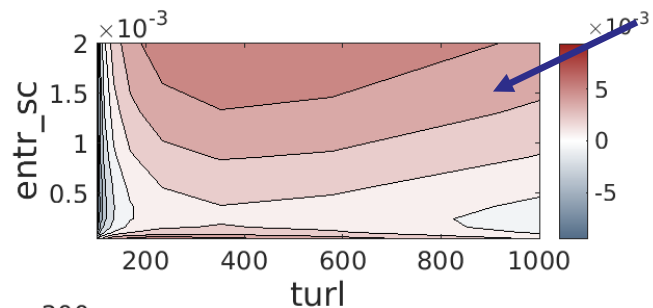
Surface layer		
Name	range	comment
c_soil	[0,1*, c_ind]	c_ind=2
rlam_heat (and rat_sea)	[0.1, 1*,2] [[1,20*,100]	<i>changes in rlam_heat must be compensated by an inverse change of rat_sea in order to maintain (at least approximately) rlam_heat*rat_sea. [0,20*, 200]</i> <i>This in principle also applies to COSMO model unless we intend to change the evaporation over water.</i>

Shallow convection		
Name	range	comment
entr_sc	[0.5 ,3, 20]E-04	

turbulence		
Name	range	comment
tur_len	[100,150*, 1000]	L_scal=MIN(0.5*I_hori, tur_len
tkhmin (and tkmmin)	[0.1, 0.4*, 1]	<i>Should be equal!</i> <i>Increasing values does not keep low clouds, decreasing values better scores</i>

Vegetation and soil		
Name	range	comment
crsmin	[50,150*,200]	

Contours of score deviation for pairwise parameters combinations



Phase-3 finished within COSMO year 2016-17

- Simulations using COSMO with a 1.1 km mesh size (same domain as in stage 2)
- The simulation period was deteriorated to one month, namely January 2013
- The number of calibrated parameters has been 5, namely *tkhmin*, *tur_len*, *entr_sc*, *crsmin* and *c_soil*
- The soil memory and the prior 3 years soil spin up has been considered using TERRA
- Better performance scores can be extracted once the MM is fitted (see figure below)
- The final optimal parameters combination obtained (with its uncertainty) once the calibration methodology is applied is:

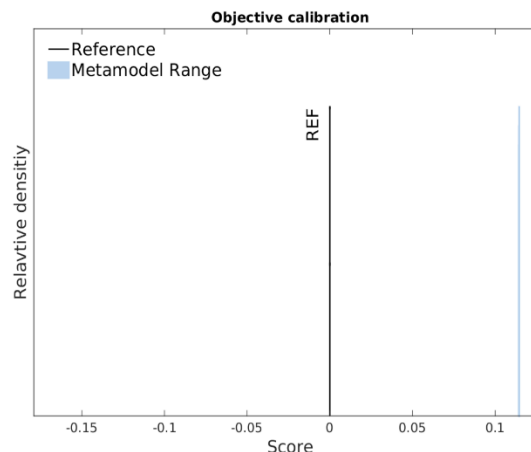
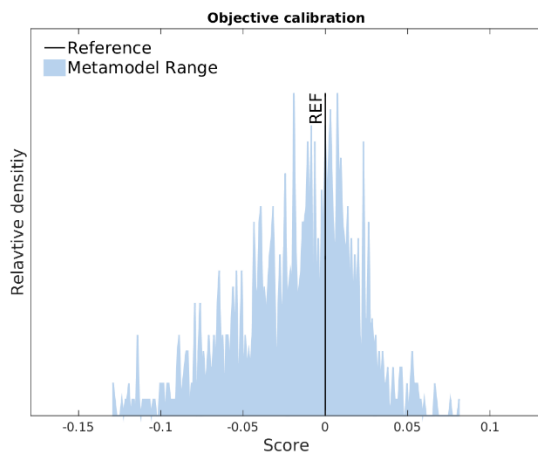
tkhmin=**1** instead of the default 0.4; Uncertainty: [0.983 1];

tur_len=**109.3** instead of the default 150; Uncertainty: [104.3 117.2];

entr_sc=**0.002** instead of the default 0.003; Uncertainty: [0.0018 0.002];

c_soil=**2** instead of the default 1.0; Uncertainty: [1.937 2];

crsmin=**200** instead of the default 150; Uncertainty: [186.3 200]



Scores distributions after **first** iteration (left) and **last** iteration (right), together with the scores of the reference (REF) simulation.

CALMO Stage	rlam_heat (0.1,2)	tkhmin	tur_len	entr_sc (10 ⁻⁴)	c_soil	v0snow
Stage-2 Entire 2013	1.149 1.273 1.390 [-6.5% +6.2%]	0.205 0.266 0.351 [-6.8% +9.4%]	294.6 346.5 409.9 [-5.8% +7.0%]	1.261 1.607 2.104 [-1.8% +2.5%]	0.515 0.588 0.664 [-3.7% +3.8%]	11.6 12.3 13.3 [-3.5% +5.0%]
Stage-2 Jan 2013	0.845 0.935 1.002 [-4.7% +3.5%]	0.191 0.220 0.262 [-3.2% +4.7%]	559.8 653.3 753.0 [-10.4% +11.1%]	2.346 2.764 3.242 [-2.1% +2.5%]	0.653 0.756 0.841 [-5.2% +4.3%]	11.2 11.8 12.3 [-3.0% +2.5%]
Stage-3 Jan 2013	Default value*	0.983 1.000 1.000 [-1.9% +0.0%]	104.3 109.3 117.2 [-0.6% +0.9%]	18.0 20.0 20.0 [-10.3% +0.0%]	1.937 2.000 2.000 [-3.2% +0.0%]	Default value*

Preliminary activity with COSMO-1 over Turin including TERRA-URB parameterisation

Edoardo Bucchignani^{1,2}, Paola Mercogliano^{1,2}, Massimo Milelli³,

1 CIRA Centro Italiano Ricerche Aerospaziali – Capua (Italy)

2 CMCC Centro Euromediterraneo sui Cambiamenti Climatici – Capua (Italy)

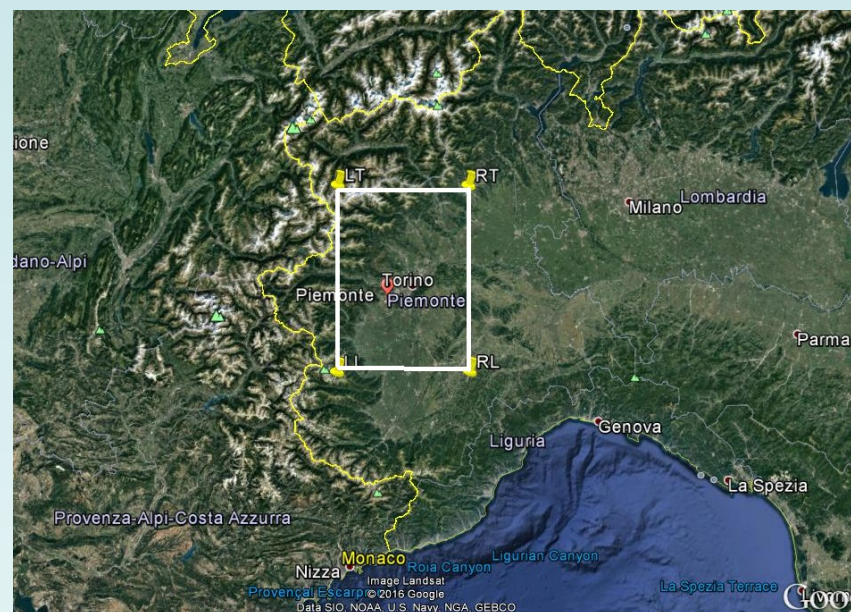
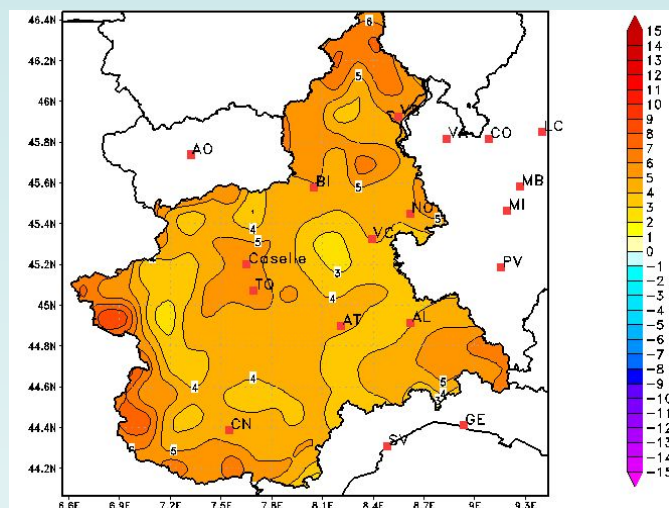
3 ARPA Piemonte – Torino (Italy)

The Test Case considered

In the period 1-16 July 2015, Piedmont region and Turin in particular experienced extreme temperature values and uncomfortable conditions for the population.

In Turin, the maximum temperature since 1990 (38.5°) has been recorded in July 2015.

Ground stations data highlighted the presence of a UHI effect over Turin.



Anomaly of Maximum temperature of the period 1-16 July 2015 with respect to the reference period 1971-2000.

Source: ARPA Piemonte
antigoni.voudouri@hnms.gr

Domain: 7.15 – 8.05 E ; 44.6 – 45.5 N

Rotated North Pole: 8 (-172)° ; 45°

Model version and set-up

- Model versions:
 - int2lm_2.0_clm4
 - cosmo_5.0_clm8 including TERRA_URB
- COSMO-CLM resolution: 0.009° (about 1 km)
- Computational domain: 100 x 100 points; 60 vertical levels, time step 3 s.
- Deep-convection resolving set-up, also including tuning settings regarding soil heat conductivity
- Time period: From 1 to 7 July 2015
- Forcing data: ECMWF IFS analysis (resolution of 0.075°)
- Validation dataset provided by ARPA Piemonte for the stations:

Moncalieri/Bauducchi	44.961111°	7.709227°
Giardini Reali	45.073699°	7.688576°
Consolata	45.076667°	7.679444°

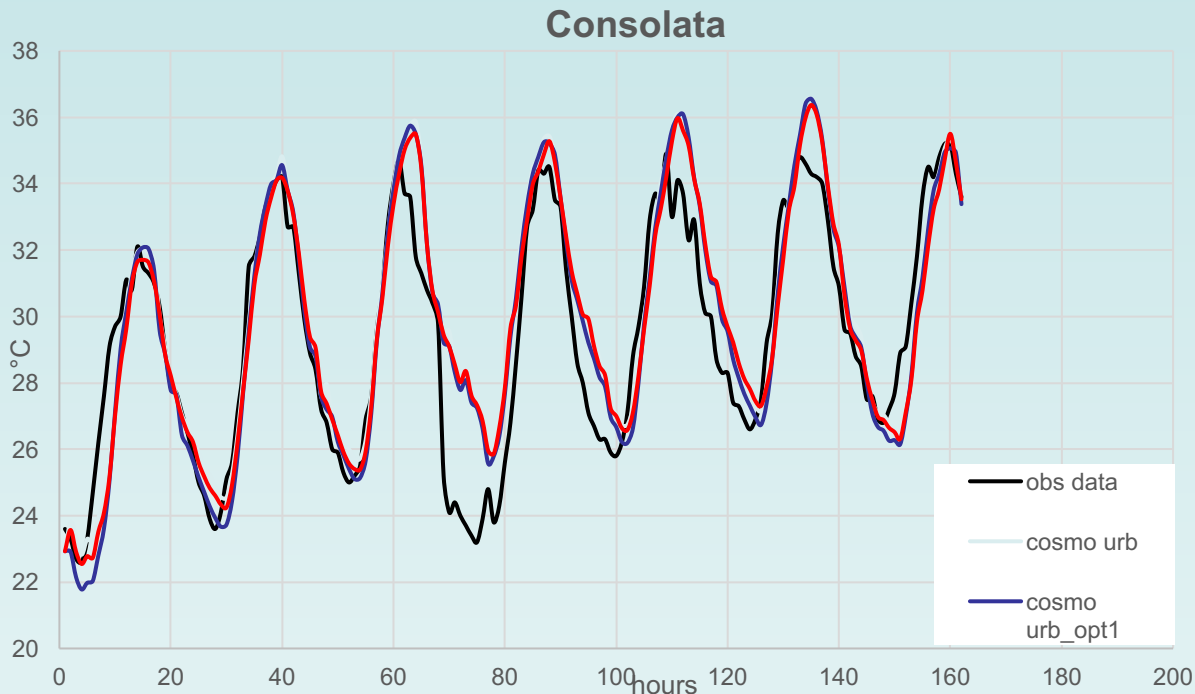
Model configuration and sensitivity

Three different model configurations have been tested:

	Default	OPT1	OPT2
rlam_heat	1.0	0.74	1.24
tkhmin	0.4	0.176	0.233
tkmmin	0.4	0.4	0.233
tur_len	150	368.8	363.9
entr_sc	0.003	0.00014	0.000267
c_soil	1.0	0.663	0.492
v0snow	20	17.8	12.1
rat_sea	20.0	20.0	16.12903

Results: Time series of T2m

Time series of T2m for Consolata station (urban cell) with the different configurations and observational data.



URB: Simulation with default control parameters

URB_OPT1: Simulation with first set of modified control parameters

URB_OPT2: Simulation with second set of modified control parameters

T2m (°C) observed value and bias over the period 1-7 July

	OBS	BIAS URB	BIAS URB_OPT1	BIAS URB_OPT2
Average bias	29.4	0.68	0.36	0.43
Maximum bias	29.4	5.5	5.0	4.9

This table shows the average observed T2m value, the average bias (model minus observation) over the simulated period and the maximum bias, obtained with the different configurations.

Comments

- Both optimized configurations allow a significant reduction of the average bias.
- OPT2 allows also a reduction of the maximum bias.

Supporting material

- The **final report is available** in the COSMO Technical Reports **No 32**
- A **detailed description of different phases** of the project is available in the COSMO Technical Reports **No 25** and **No 31**.
- The **code of the meta-model**, including the associated documentation is available in <http://www.cosmo-model.org/content/support/software/default.htm#calmo>
- A **peer reviewed paper** has been published in Atm. Res. vol. 190; a second peer reviewed paper is in the review process.
- More information and documentation on CALMO and CALMO–MAX at the following <http://www.cosmo-model.org/content/tasks/priorityProjects/calmoMax/default.htm>
<http://www.cosmo-model.org/content/tasks/priorityProjects/calmo/default.htm>

References

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- Voudouri A., E. Avgoustoglou and P. Kaufmann, 2017: Impacts of Observational Data Assimilation on Operational Forecasts. Perspectives on Atmospheric Sciences, Vol.1, Springer, pp 143-150
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CALMO-MAX

- No definitive answer on the possibility to **improve the model performance**
- No full assessment of the effect of the **soil memory**
- Optimization of the method in terms of **computing resources** is pending

- Need to
 - ✓ define the model configuration for the COSMO-1 calibration, incl. the code, the namelist, prepare the initial conditions with TSA, test the chosen model configuration
 - ✓ define the set of model parameters to calibrate and collect the observations for the MM
 - ✓ define the calibration strategy to reduce computational cost,
 - ✓ define the performance score to use and accordingly adapt the MM

ETHZ parameter list

Calibration of the 50km COSMO-gpu model (the POMPA version)

New features: Implementation of the revised TERRA_ML scheme (Schlemmer et al. 2017, in prep). With the new formulation the conductivity and diffusivity parameter is replaced with a new parameter (gamma) that regulates how much runoff is produced.

Table of the parameters that was used to calibrate the CCLM5.0-6 version.

The following table lists the parameters are used for the calibration, the values given in the Values column are [minimum value; default value; maximum value]:

Suggested new parameters, changes:

Parameter name	Description of the parameter	Values
rlam_heat	Scalar resistance for sensible and latent heat fluxes in the laminar surface layer	[0.1;1;5]
entr_sc	Entrainment rate for shallow convection [m^{-3}]	[$3 \cdot 10^{-5}$; $3 \cdot 10^{-4}$; $3 \cdot 10^{-3}$]
tkhmin	Minimal vertical turbulent diffusion rate [$\text{m}^2 \text{s}^{-1}$]	[0.1; 1 ; 2]
qi0	Threshold for conversion cloud ice to snow	[0 ; $5 \cdot 10^{-5}$; 10^{-4}]
uc1	Parameter controlling the vertical variation of critical relative humidity for sub-grid cloud formation	[0; 0.8 ; 1.6]
radfac	Fraction of cloud water and ice considered by radiation scheme	[0.3; 0.5 ; 0.9]
fac_rootdp2	Uniform factor for root depth field	[0.5; 1 ; 1.5]
soilhyd	Factor for the hydraulic conductivity and diffusivity	[0.1;1;10]

Use the default value (0)

Decrease the range [0;**0.3**;0.6]

Replace with the gamma. Now it is set to 0.4. Need to decide the range

Work of O. Bellprat

Acronym	Parameter	Value
Minimal diffusion coefficient for heat	tkhmin	[0. 1 ,0.4,2] COSMO-CLM 1
Factor for laminar resistance for heat	rlam_heat	[0.1,1,10]
Threshold for the conversion from ice to snow	qi0	[0,5e-5, 1e-4]
Entrainment rate for shallow convection	entr_sc	[3e-5,3e-4,3e-3]
Parameter controlling the vertical variation of critical relative humidity for sub-grid cloud formation	uc1	[0,0.8,1.6]
Uniform factor for root depth field	root_dp (fac_root_dp)	[0.5,1,1.5] [0.1in src_soil.f90)
<i>Factor for vertical velocity of snow</i>	<i>v0snow</i>	<i>[5,20,35]</i>
Fraction of cloud water and ice considered by the radiation scheme	radfac	[0.3,0.5,0.9]
Factor for hydraulic conductivity	oilhyd	[1, 6]
antigoni.voudouri@hnms.gr	(kexpdec)	33

