

# CRNS - new insights from modeling soil moisture measurement at the hectometer scale

07.10.2021 Markus Köhli<sup>1,2</sup>, Jannis Weimar<sup>1</sup>, Martin Schrön<sup>3</sup> and Ulrich Schmidt<sup>1</sup>

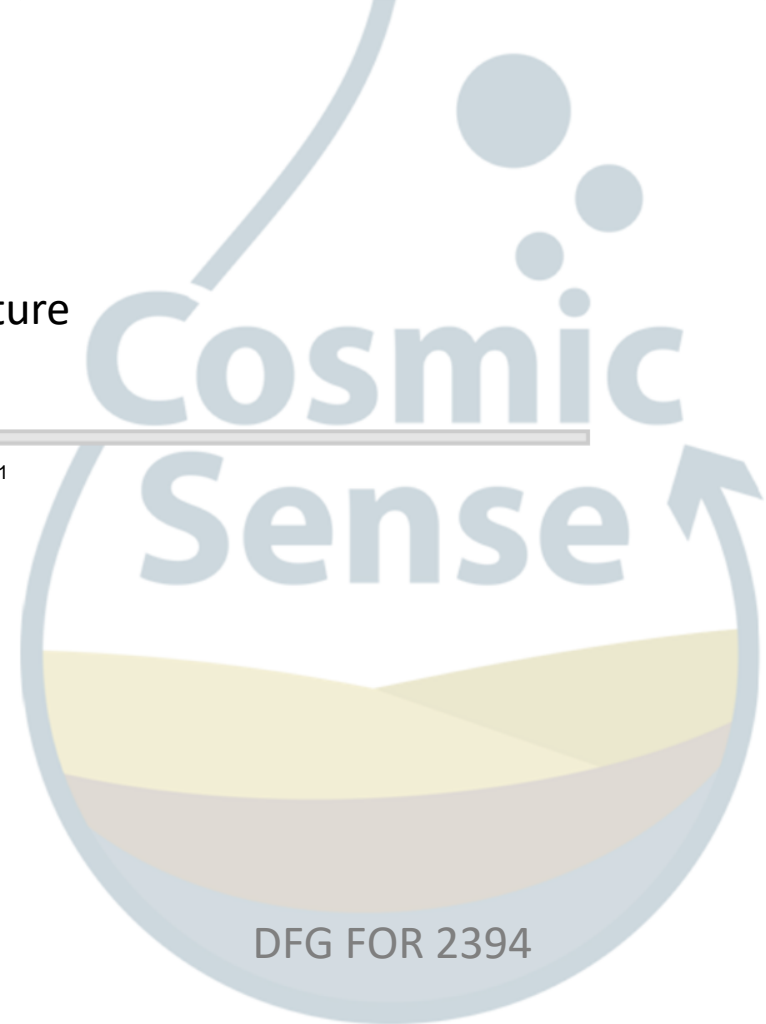
<sup>1</sup> Physikalisches Institut, Heidelberg University, Heidelberg, Germany

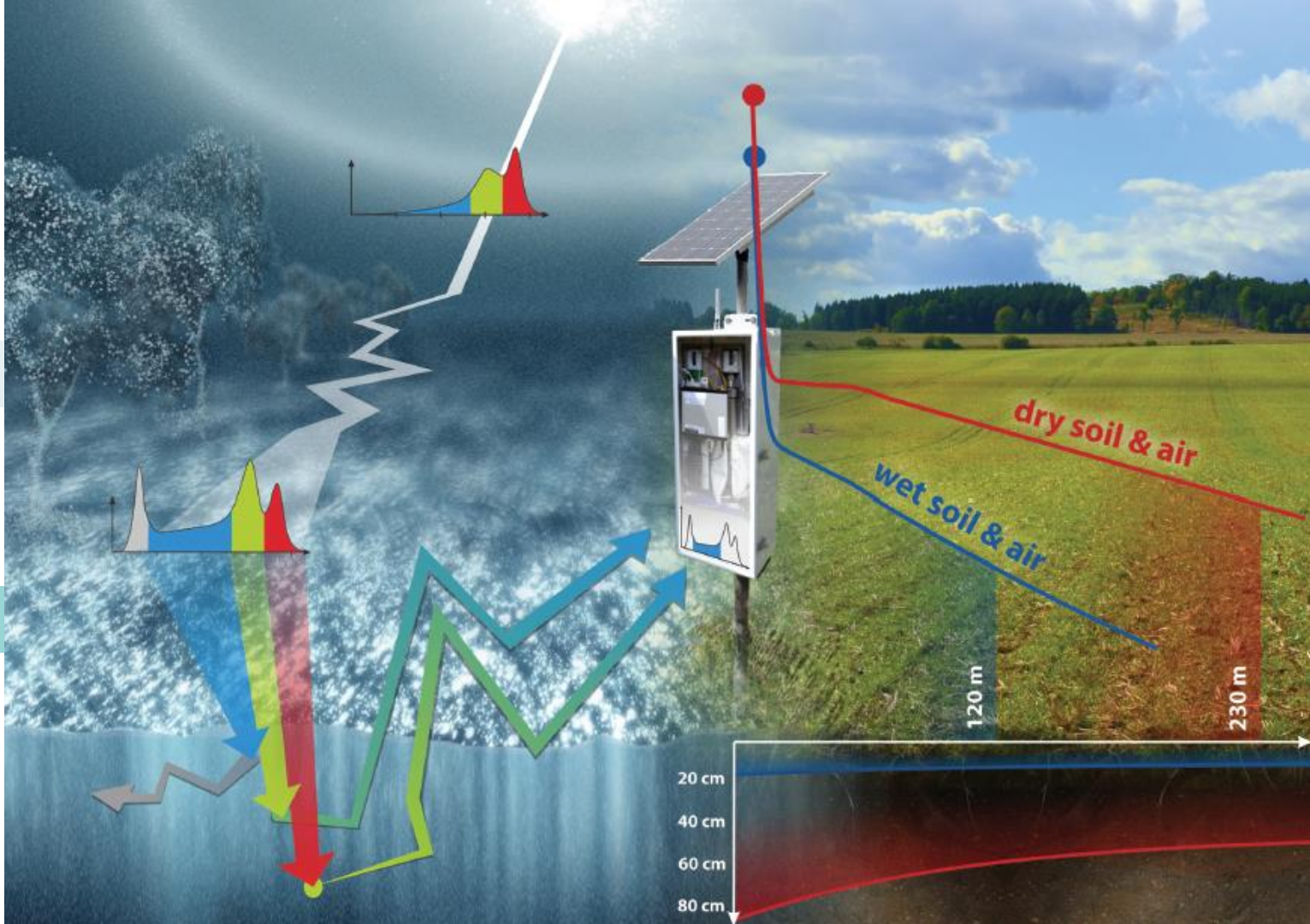
<sup>2</sup> Physikalisches Institut, University of Bonn, Bonn, Germany

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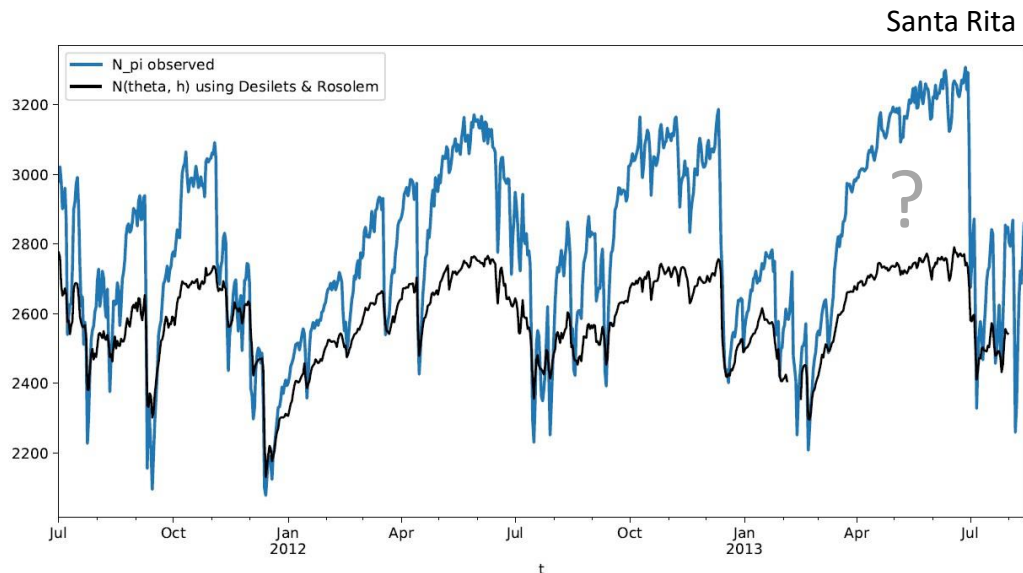
Physikalisches Institut  
Heidelberg University  
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Many studies were carried out for **finding a sensor calibration routine** and to compare the performance to conventional instruments...  
Rivera Villarreyes et al., 2011; Franz et al., 2012a; Hawdon et al., 2014; Almeida et al., 2014; Coopersmith et al., 2014

with a good agreement between measured neutron flux and soil moisture values



However, unexplained features in the CRNS data could not be described by the Desilets equation

$$\theta(N) = \frac{0.0808}{\left(\frac{N}{N_0}\right) - 0.372} - 0.115$$

Then,

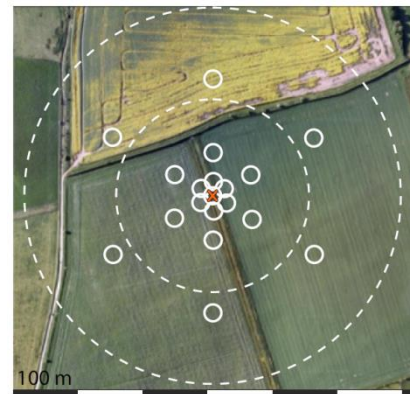
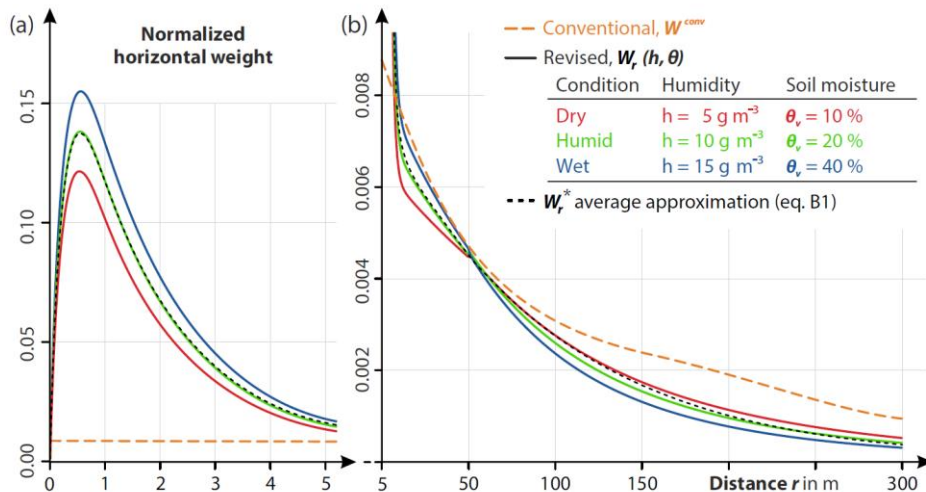
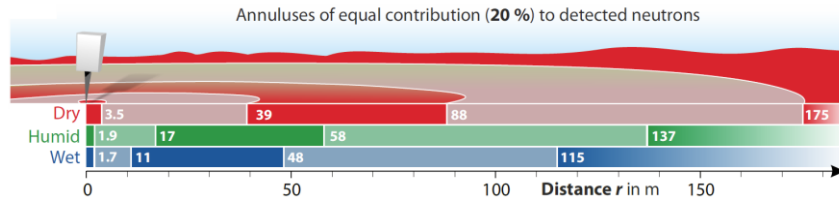
groups tried to **fit the parameters** of the hyperbola to their data  
Rivera Villarreyes et al., 2011; Lv et al., 2014; Heidbüchel et al., 2016; Sigouin and Si, 2016

with a better correlation **at the cost of site-specific calibrations**

One reason:  
different weighting strategy needed

→ Footprint revision

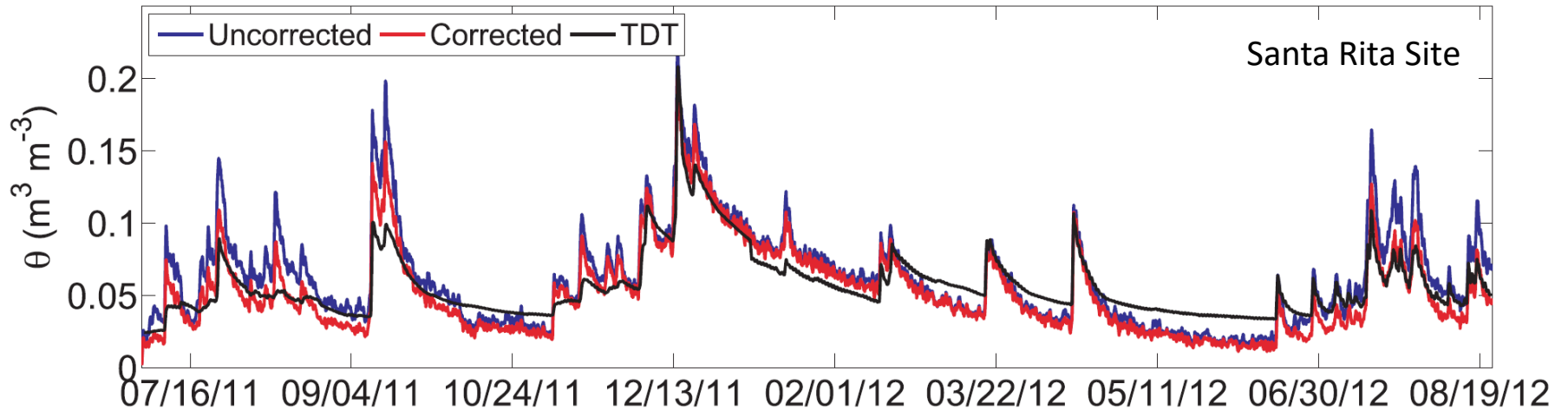
Köhli et al. 2015; Schrön et al. 2017



But still:

Desilets equation / N0 method: bad performance under dry conditions

(b)



R. ROSOLEM, et al. "The Effect of Atmospheric Water Vapor on Neutron Count in the Cosmic-Ray Soil Moisture Observing System." *Journal of Hydrometeorology* 14(5), 2013, 1659–1671.

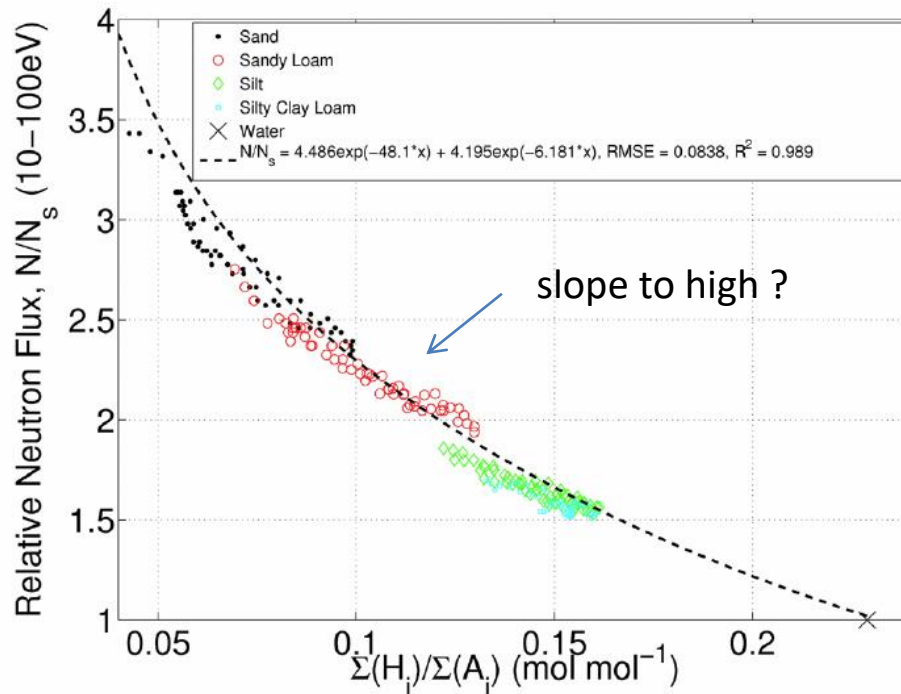
Other intensity description approaches

Universal calibration function (UCF) / HMF method

$$\text{hmf} = \frac{\sum H_i}{\sum A_i}$$

$$= \frac{H_\tau + H_{\text{SOC}} + H_\theta + H_{\text{AGB}}}{\text{NO} + \text{SiO}_2 + \text{H}_2\text{O}_\tau + \text{H}_2\text{O}_{\text{SOC}} + \text{H}_2\text{O}_\theta + \text{C}_6\text{H}_{10}\text{O}_5 + \text{H}_2\text{O}_{\text{AGB}}}$$

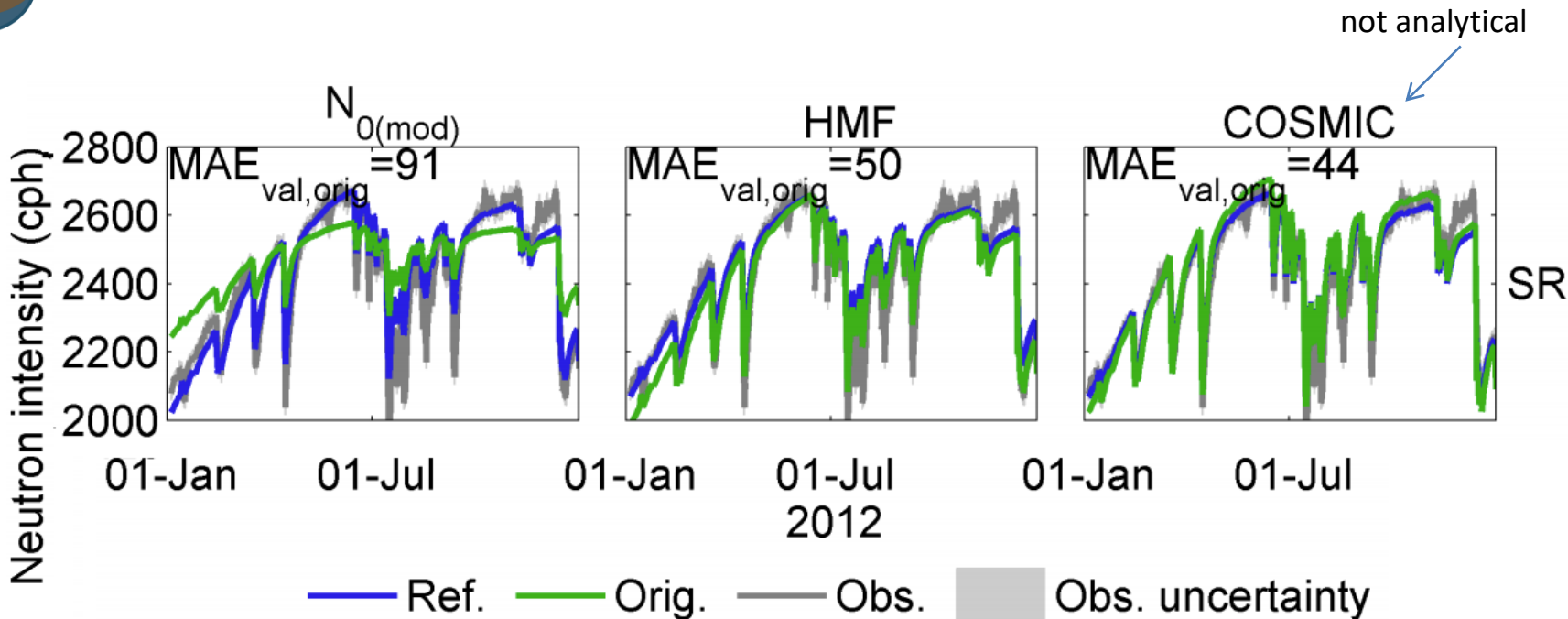
$$\frac{N}{N_s} = 4.486 \exp(-48.1 \cdot \text{hmf}) + 4.195 \exp(-6.181 \cdot \text{hmf}).$$



T. FRANZ, et al. "A universal calibration function for determination of soil moisture."  
*HESS* 17(5), 2013, 453-460.



# NS > Comparison

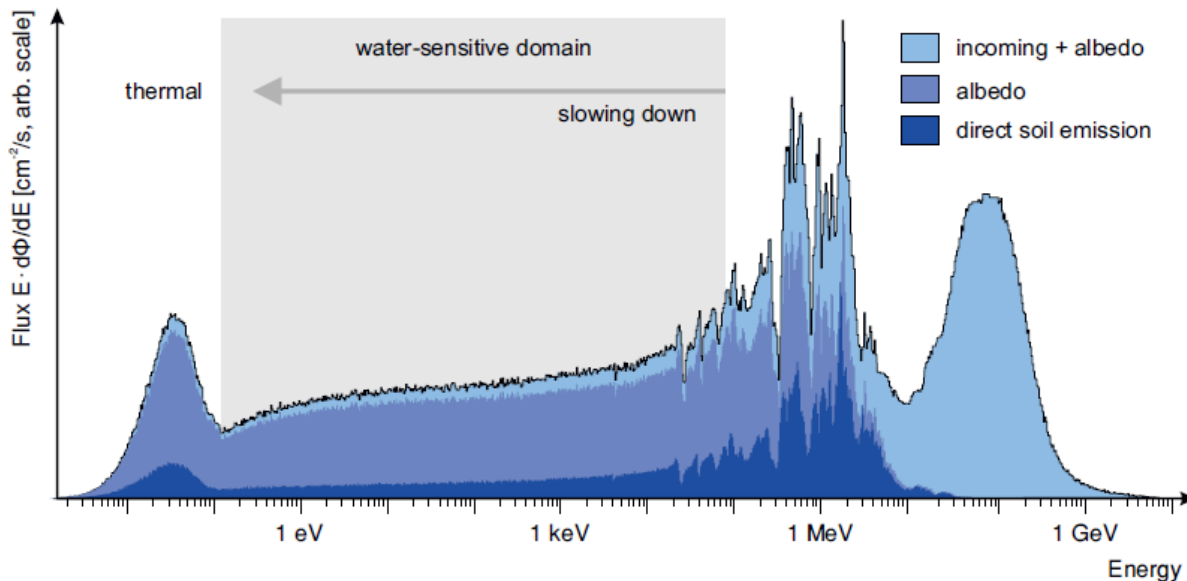


J. IWEMA et al. "Investigating temporal field sampling strategies for site-specific calibration of three soil moisture–neutron intensity parameterisation methods." *Hydrology and Earth System Sciences* 19(7), 2015, 3203–3216.



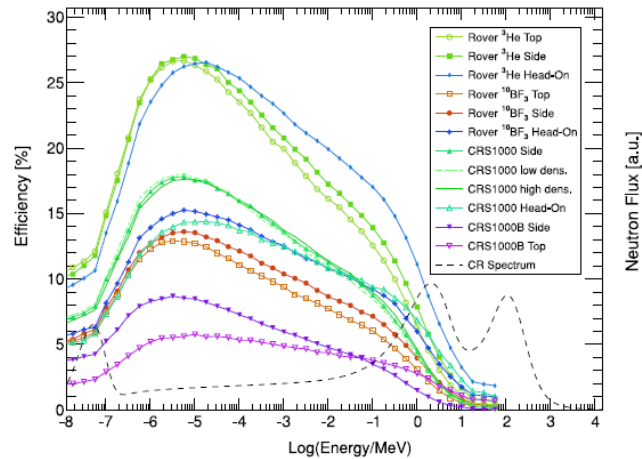
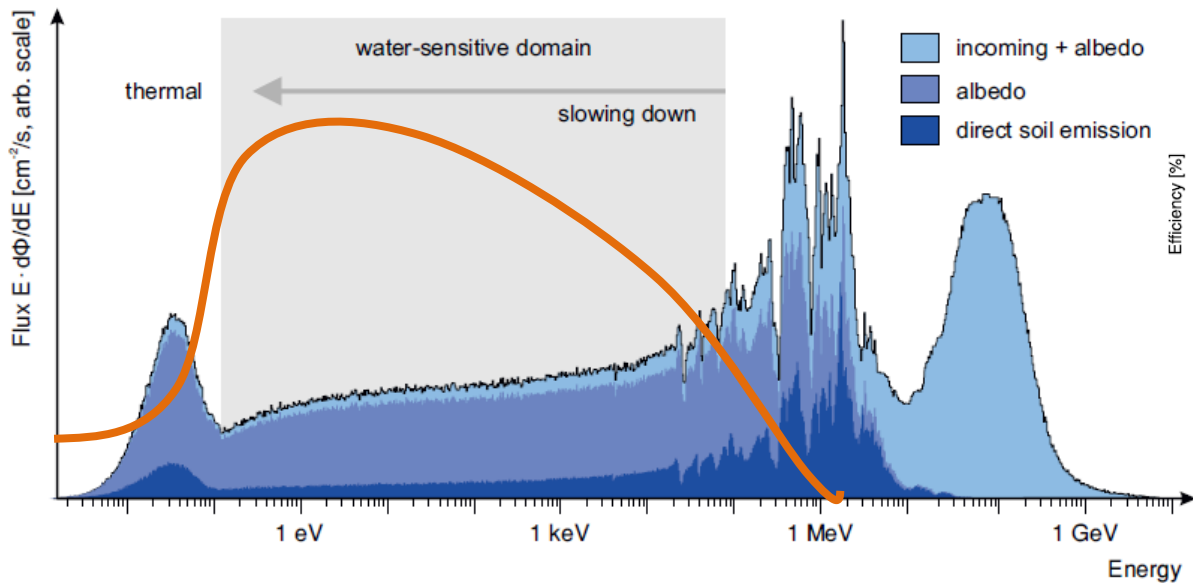


Epithermal flux is not the result from one single process



- generation in the air
- generation in the ground
- slowing down by hydrogen
- absorption

Take into account the relative detection efficiency

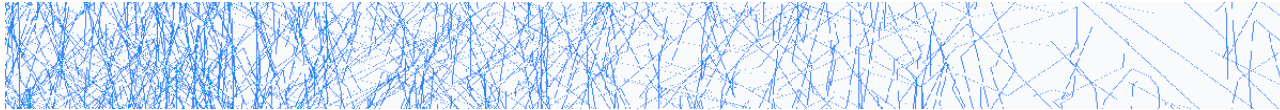


Köhli et al. 2018

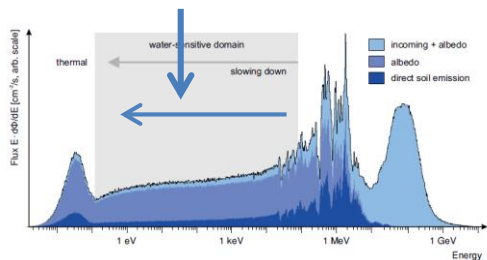


## NS > Mathematical description

Understand the mathematics of neutron transport:



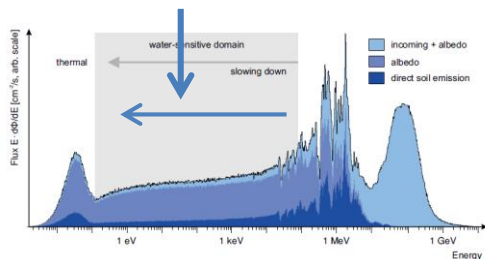
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$$I(\theta) \propto \Phi_{\text{epith}}(\text{H}_2\text{O}) \propto n_{\text{col}}^{\text{ground}} \propto \frac{\Sigma^{\text{soil}} + w \Sigma^{\text{water}}}{\Sigma^{\text{soil}} \zeta^{\text{soil}} + w \Sigma^{\text{water}} \zeta^{\text{water}}}$$

Hyperbola-shaped

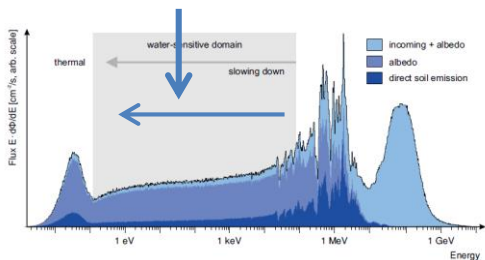


weight fraction of water  $w$   
 cross section  $\Sigma$   
 logarithmic energy decrement per collision  $\zeta$

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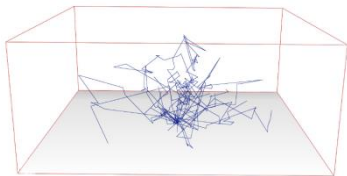
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Hyperbola-shaped



weight fraction of water  $w$   
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+ Diffusive Transport



$$\Phi \propto \exp(-r)/r^2$$

exponentially shaped

$$\Phi \propto \exp(-r)/r$$



## NS > Intensity Function

Our proposition: the universal transport solution (UTS)

$$I(\theta, h) = N_D \left( \frac{p_1 + p_2 \theta}{p_1 + \theta} + e^{-p_3 \theta} \right)$$



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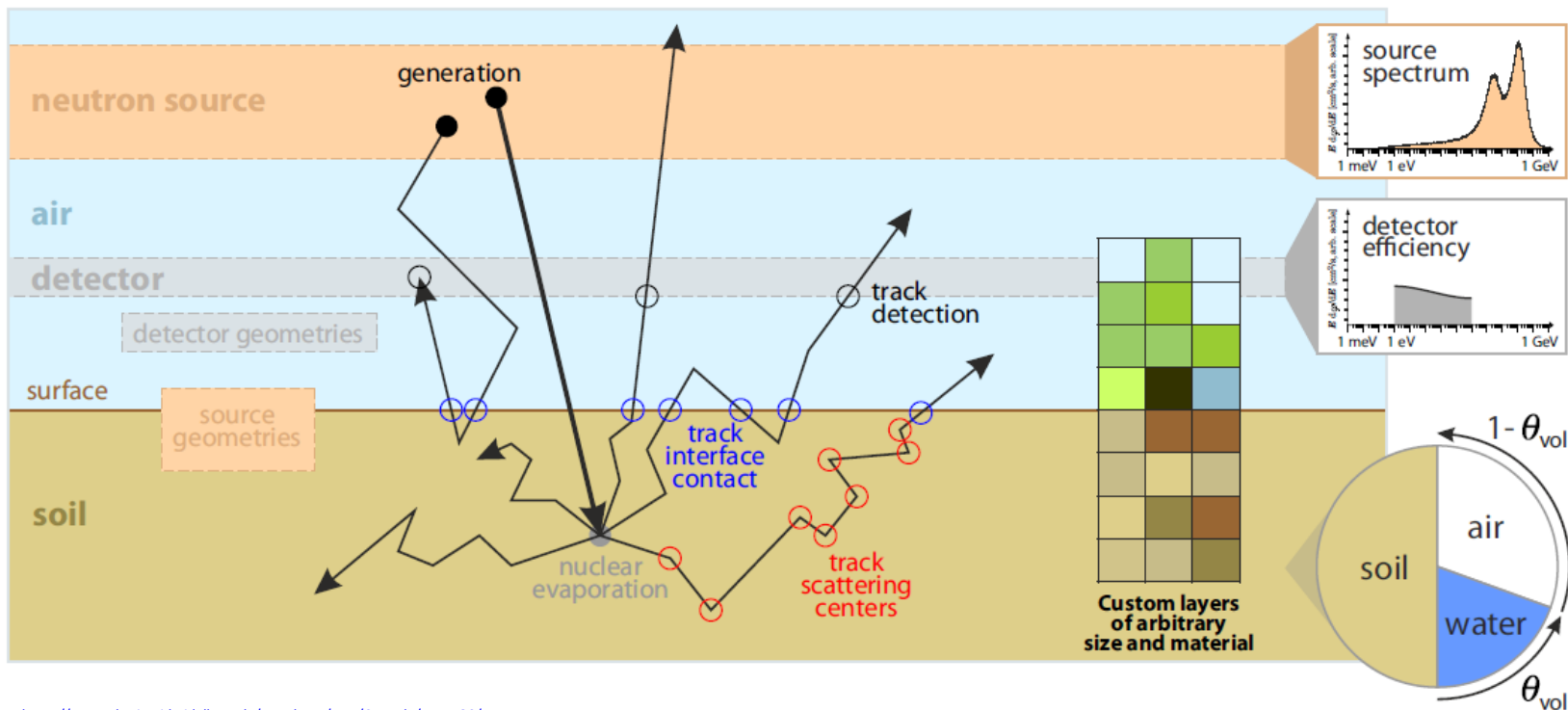






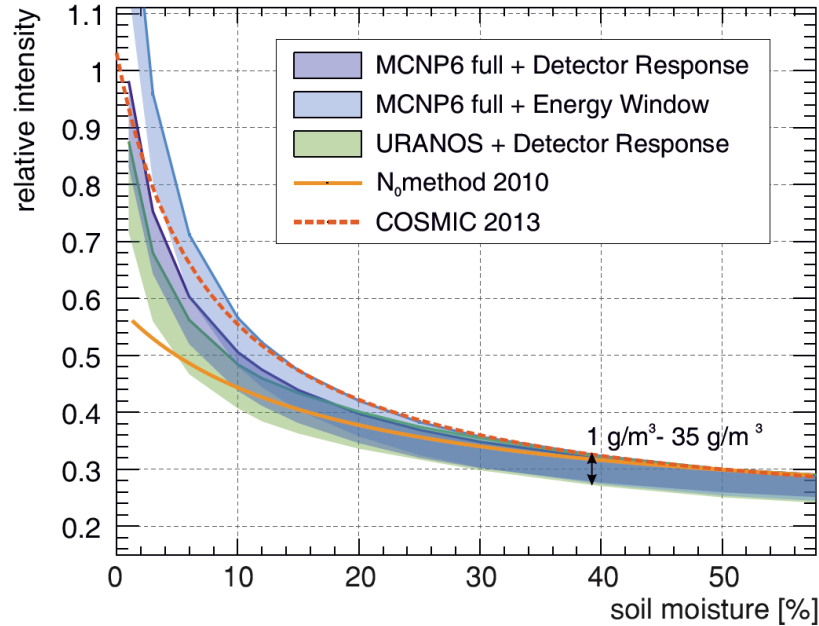
# NS > Simulating the above-ground intensity

The simulation toolkits used in this study are MCNP 6.2 and URANOS. The air medium consists of 78% nitrogen, 21% oxygen and 1% argon usually at a pressure of 1020 mbar. The soil consists of 50%Vol solids and a scalable amount of H<sub>2</sub>O. The solid domain is comprised of 75%Vol SiO<sub>2</sub> and 25%Vol Al<sub>2</sub>O<sub>3</sub> at a compound density of 2.86 g/cm<sup>3</sup>. The input spectrum used in this work relies on the cosmic-ray propagation models by Sato et al.





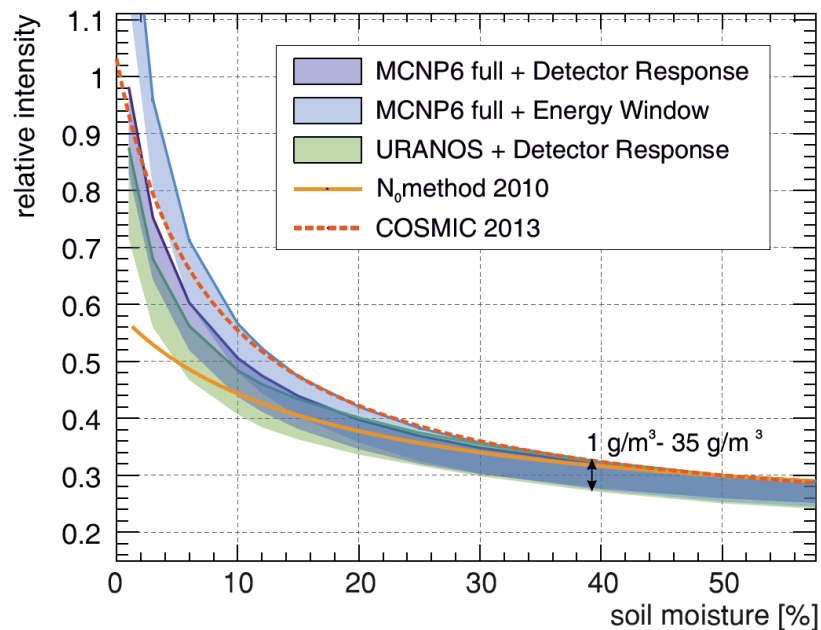
# NS > Simulation results



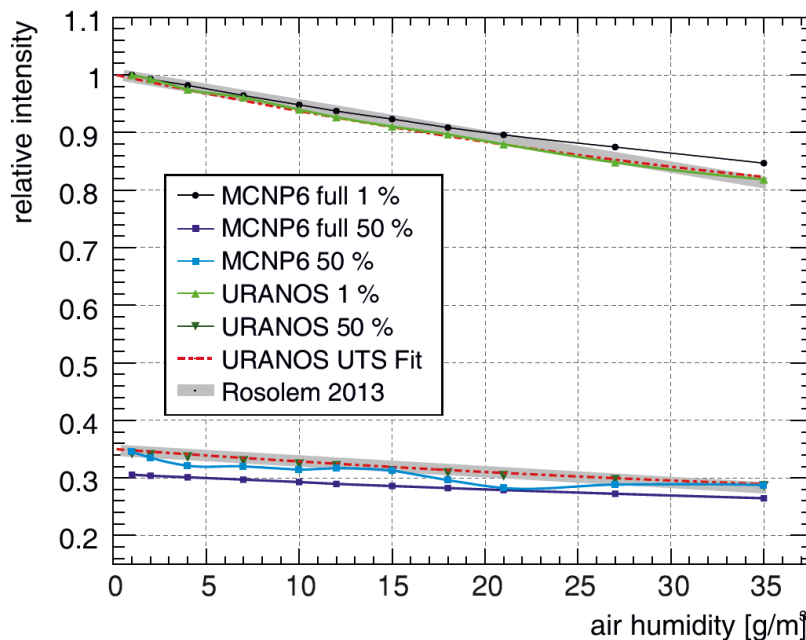
- NO method is not steep enough in dry regions
- Exponential methods like Cosmic are more suitable for low soil moisture values
- Using fixed lower and upper bounds for scoring leads to a significantly steeper soil moisture relation. The detector response includes thermal and MeV neutrons, both scaling less good than the epithermal range.



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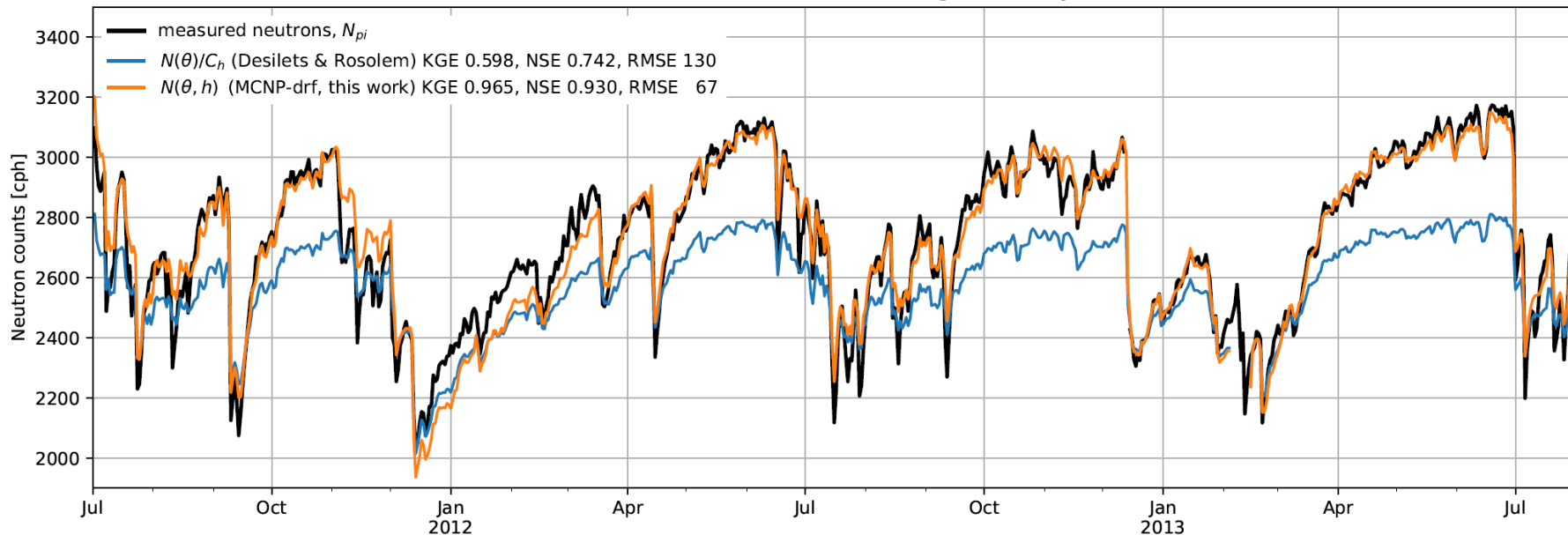
For humid compared to dry air the maximum achievable count rate is reduced by 20%. This quantitatively agrees with Rosolem et al. (2013) who studied the change from dry to  $22 \text{ g/m}^3$ . However, a strictly linear relationship for water vapor cannot be verified. The presented reduction rate of  $0.0054$  per gram air humidity seems to hold only for dry conditions.



# NS > Experimental evidence – dry conditions

M. Köhli et al. "Soil Moisture and Air Humidity dependence of the above-ground cosmic-ray neutron intensity" *Front. Water*, 2, 2021.

COSMOS Santa Rita ( $\theta \approx 7 \pm 3 \%$ ,  $h \approx 7 \pm 4 \text{ g/cm}^3$ ), daily resolution



Caution! Here: soil moisture converted to neutron counts

Data from Santa Rita (T. Franz)

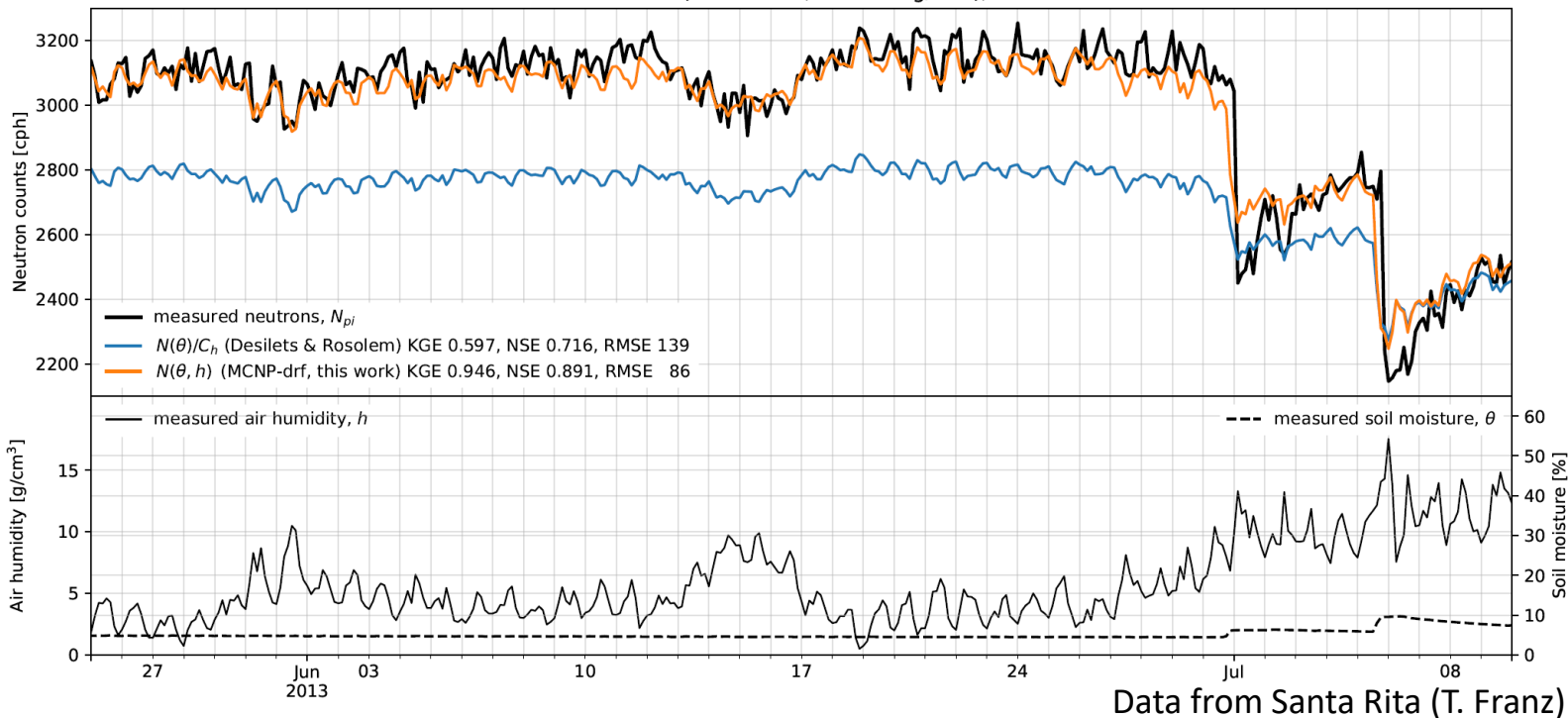


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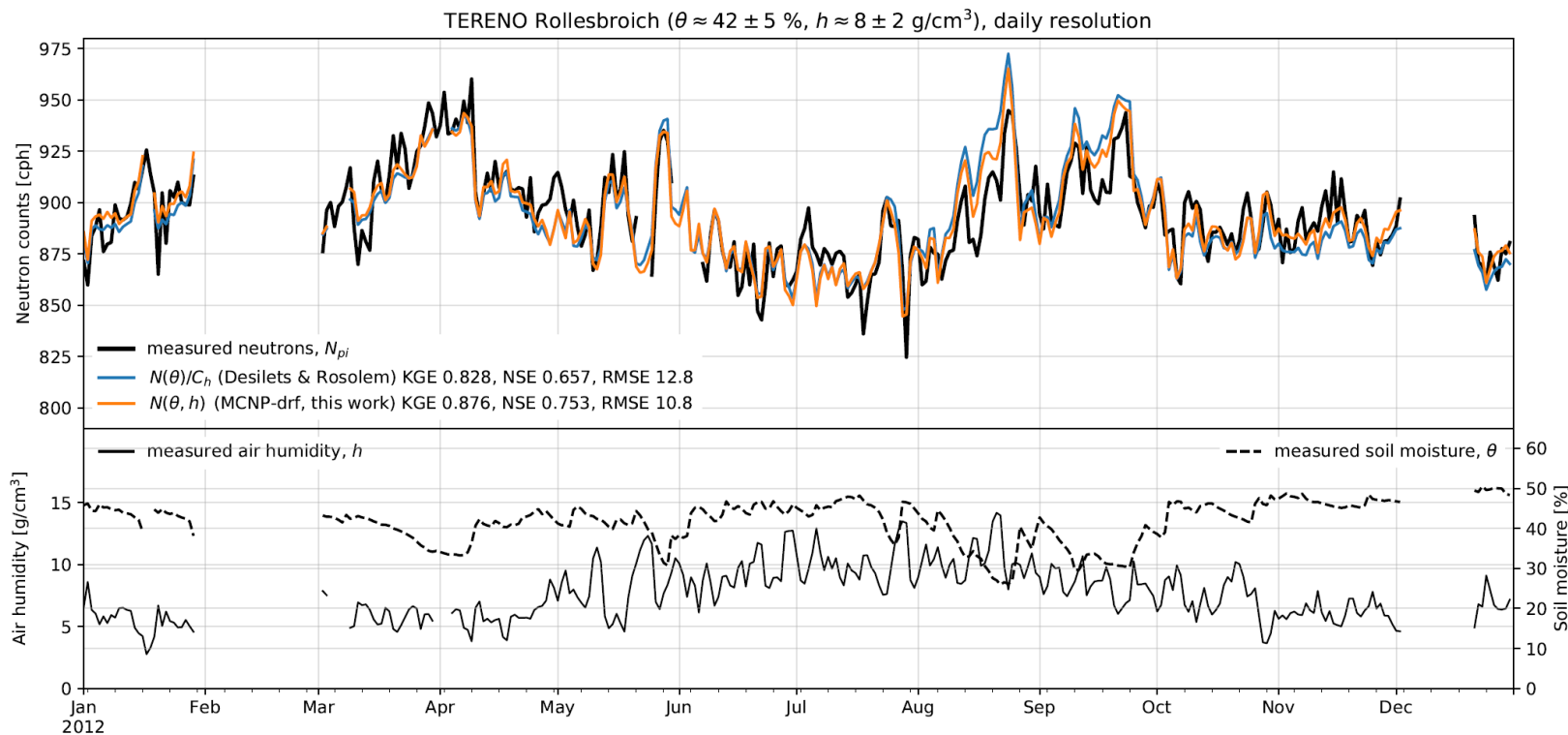
## Zoom-In: air humidity scaling

COSMOS Santa Rita ( $\theta \approx 7 \pm 3 \%$ ,  $h \approx 7 \pm 5 \text{ g/cm}^3$ ), 3h resolution





# NS > Experimental evidence – wet conditions

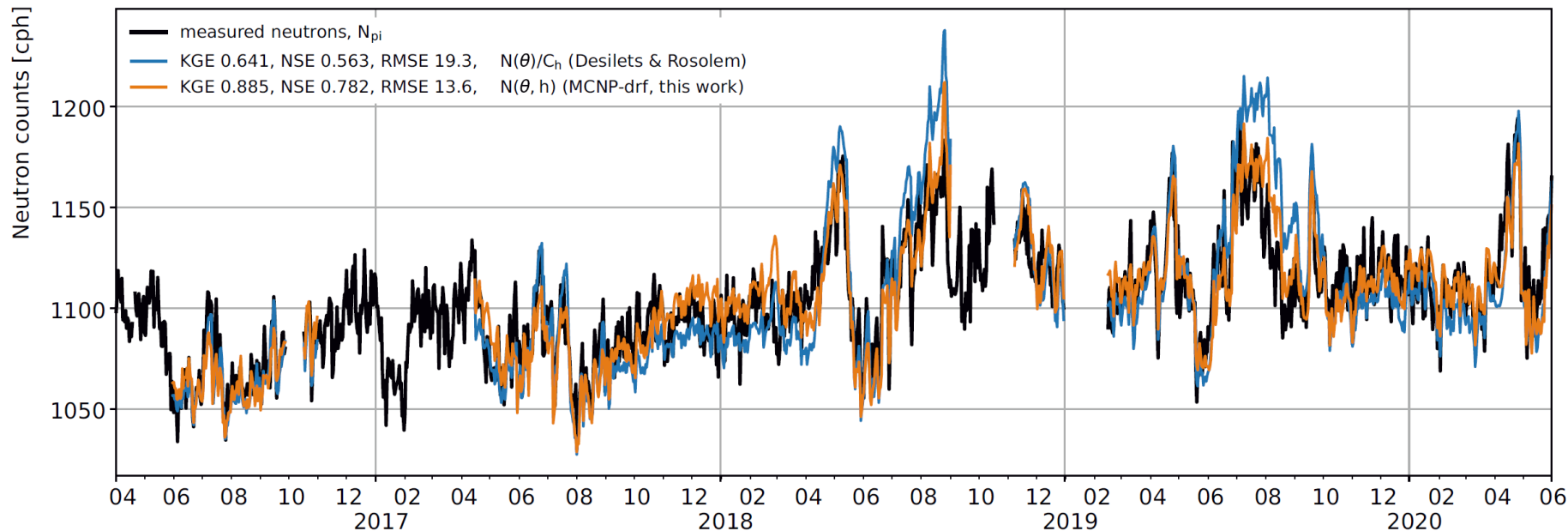


Data from Rollesbroich (R. Baatz)



# NS > Experimental evidence – wet conditions

TERENO Fendt ( $\theta \approx 45 \pm 10 \%$ ,  $h \approx 8 \pm 3 \text{ g/cm}^3$ ), daily resolution



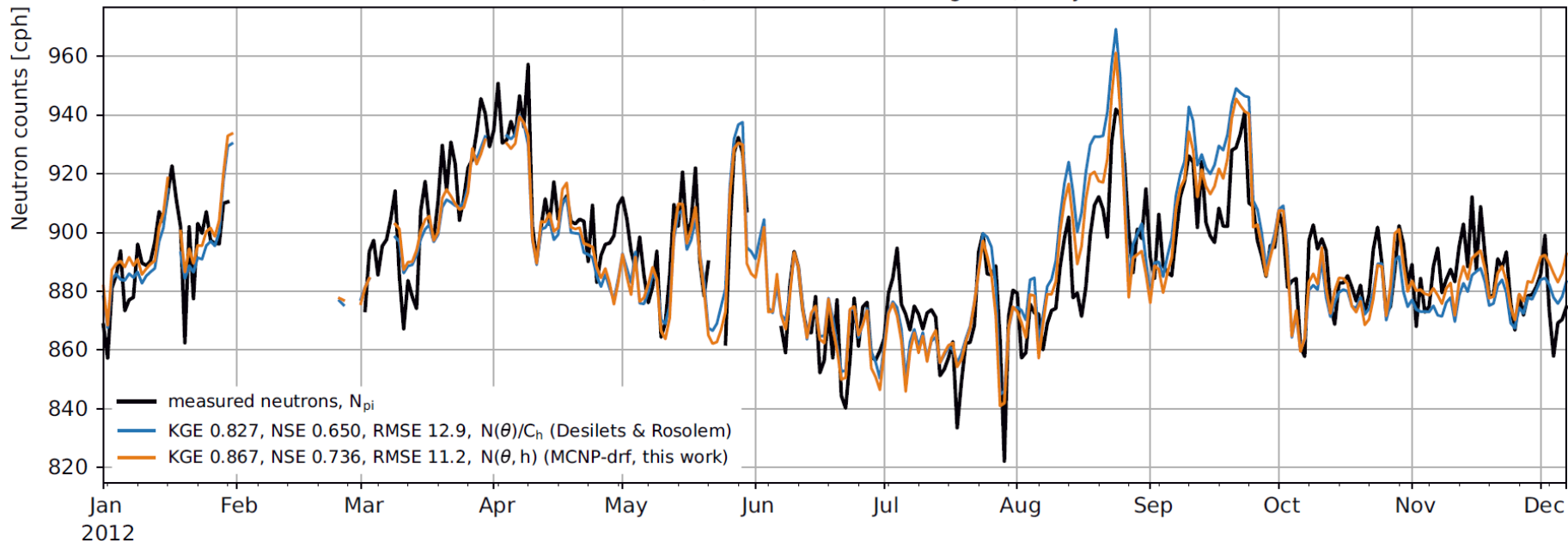
Data from Fendt (B. Fersch, KIT)



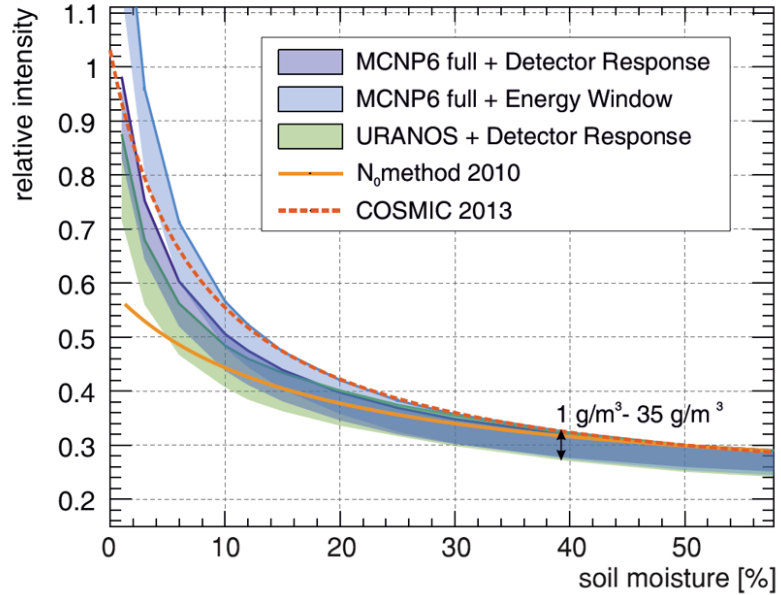


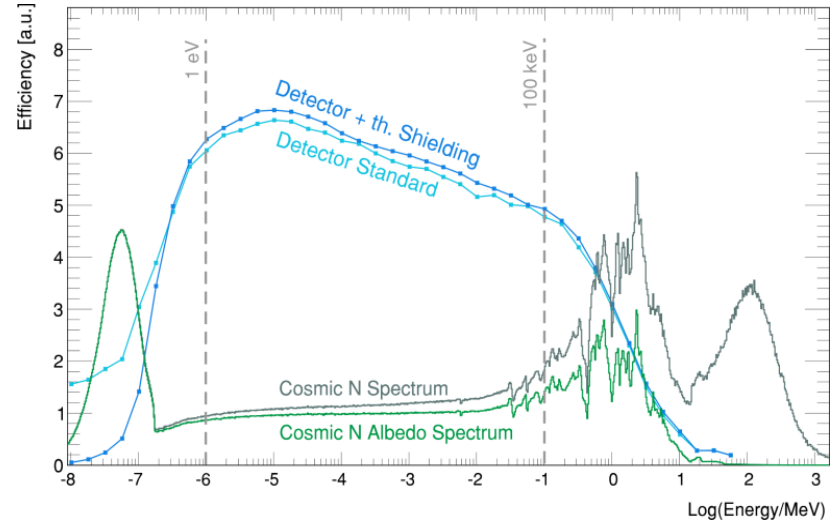
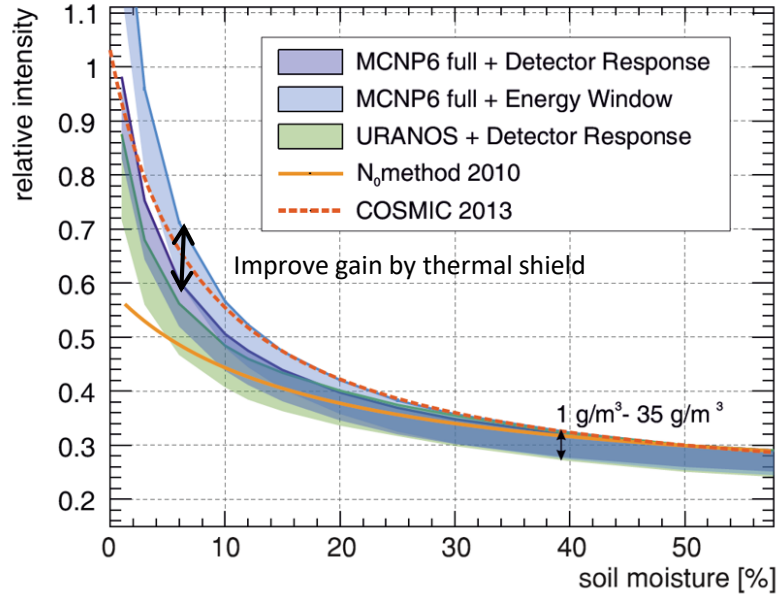
# NS > Experimental evidence – wet conditions

TERENO Rollesbroich ( $\theta \approx 42 \pm 5 \%$ ,  $h \approx 7 \pm 3 \text{ g/cm}^3$ ), daily resolution



Data from Rollesbroich (R. Baatz, FZJ)





## Gadolinium Coating

approx. 90 % absorption efficiency to cadmium cutoff (0.5 eV)  
 equals ~95 % in thermal regime (< 0.1 eV)



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- New **CRNS intensity function** found by **understanding the contributions** and **improving the corrections of CR neutrons to the signal**.

**Combined function for soil moisture and humidity:**

$$I(\theta, h) = N_D \left( \frac{p_1 + p_2 \theta}{p_1 + \theta} (p_0 + p_6 h + p_7 h^2) + e^{-p_3 \theta} (p_4 + p_5 h) \right)$$





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- Thermal shields can significantly improve the signal response



# Backup





## NS > UTS fit results

| Set                 | $p_0$  | $p_1$  | $p_2$ | $p_3$ | $p_4$ | $p_5$    | $p_6$   | $p_7$     |
|---------------------|--------|--------|-------|-------|-------|----------|---------|-----------|
| 1: MCNP drf (full)  | 1.0940 | 0.0280 | 0.254 | 3.537 | 0.139 | -0.00140 | -0.0088 | 0.0001150 |
| 2: MCNP ewin (full) | 1.2650 | 0.0259 | 0.135 | 1.237 | 0.063 | -0.00021 | -0.0117 | 0.0001200 |
| 3: URANOS drf       | 1.0240 | 0.0226 | 0.207 | 1.625 | 0.235 | -0.00290 | -0.0093 | 0.0000740 |
| 4: URANOS ewin      | 1.2230 | 0.0185 | 0.142 | 2.568 | 0.155 | -0.00047 | -0.0119 | 0.0000920 |

Results for the parameters  $p_0$  -  $p_7$



# NS > Intercomparison

## URANOS (450 m to ground) VS MCNP6 (100 m to ground)

