



## Sensitivity of the process-based model DNDC on microbiological parameters

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### Abstract

Process-based model such as DNDC rely on a large numbers of parameters which were defined by the model developer on the basis of existing references. Subsequently, some values have been changed to improve model performance for specific applications, often without adequate documentation. Many of these parameters are thus estimates of the real values appropriate for local conditions introducing approximation errors for applications at larger scales. Spatially explicit datasets might be required for some parameters for which model output is highly sensitive. We will present a sensitivity analysis of 38 mainly micro-biological internal parameter of DNDC-EUROPE.

### Objective

- Test mechanistic model DNDC (Denitrification Decomposition) on its sensitivity of internal parameters
- Output parameters tested: N<sub>2</sub>O fluxes, NO fluxes, carbon stock changes and N-leaching
- Identify parameter for which the output parameters are insensitive → model simplification
- Identify parameters for which the output parameters are most sensitive → additional efforts required to provide spatially explicit values of the parameters

### Method

- 1) First, a list of sample points from the marginal pdfs of the  $k$  input parameters using a quasi-Monte Carlo generator (Sobol', 1967) is generated.
- 2) DNDC is run for 800 blocks of  $k+2$  rows with realizations of the  $k$  parameters (→ 32000 runs for each spatial unit)
- 3) Sensitivity analysis is done with two different methods
  - Method of Sobol' as improved by Saltelli et al (2010)
  - A random forest meta-model (Villa-Vialaneix et al., 2011)

### Results

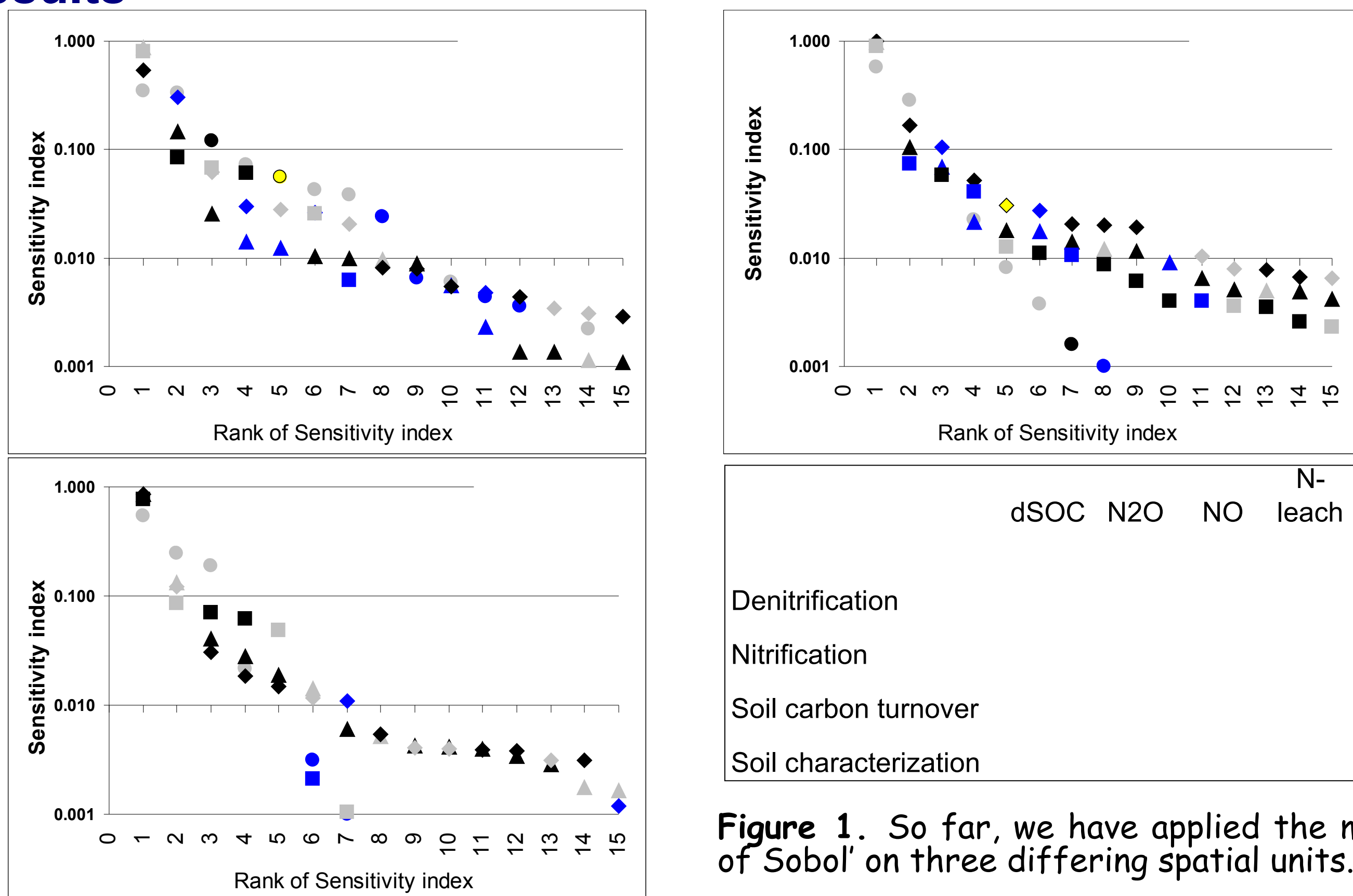


Figure 1. So far, we have applied the method of Sobol' on three differing spatial units.

	345	941	9744
Max. relative growth of NO <sub>2</sub> denitrifiers	NO 0.99		
Specific decomposition rate - field reduction factor	N <sub>2</sub> O 0.97	dSOC 0.24	N <sub>2</sub> O 0.88
Specific decomposition rate residues, labile	N <sub>2</sub> O 0.85		N <sub>2</sub> O 0.80
Ratio of denitrifiers to total microbial biomass	NO 0.85	NO 0.54	
Ratio of denitrifiers to total microbial biomass	N <sub>2</sub> O 0.77		
Soil respiration rate per hour	dSOC 0.58	dSOC 0.54	dSOC 0.33
Ratio of microbial to total organic C		dSOC 0.19	dSOC 0.35
Efficiency coefficient for resistant humus decomposition	dSOC 0.29		
C/N ratio humus			dSOC 0.31

- Altogether, the output variables showed to be sensitive towards about 50% of the tested parameters
- The ranking of the sensitivities is depending on the output variable and the environmental condition at the spatial unit

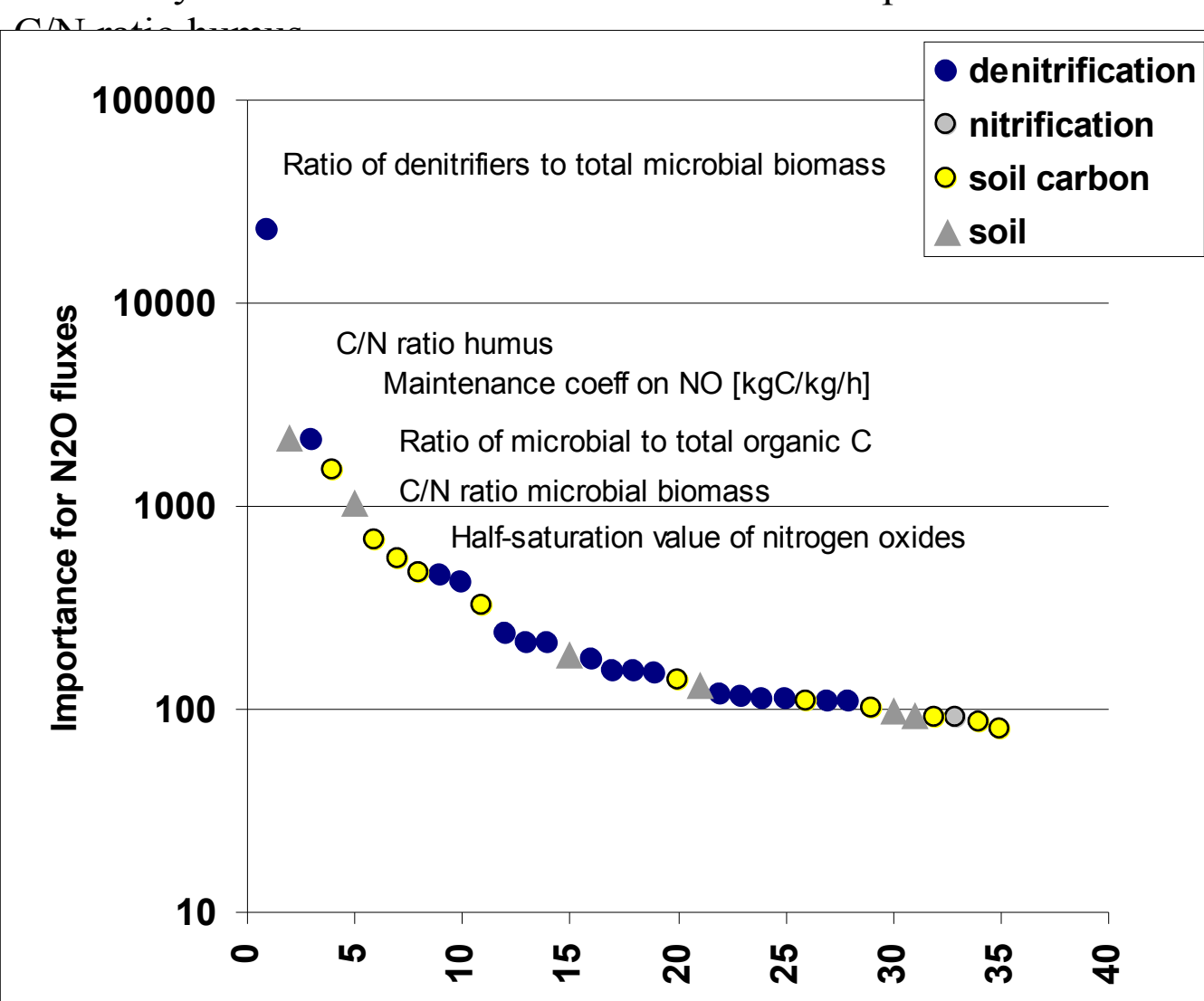


Figure 2. For comparison, the figure shows the importance of the parameters for N<sub>2</sub>O fluxes as estimated by the random forest model.

- N<sub>2</sub>O emissions show strongest sensitivity to denitrifier/total microbial biomass and the specific decomposition rate. Sensitivity for N<sub>2</sub>O and NO dominated by few parameters
- dSOC has highest sensitivity on soil respiration rate

#	Acronym	Parameter description	Value	Process	Distribution
1	DRF	Specific decomposition rate - field reduction factor	0.045	soil carbon turnover	Normal
2	EFFRB	Efficiency coefficient for labile humus decomposition	0.67	soil carbon turnover	Triangular
3	srh	Soil respiration rate per hour	0.16	soil carbon turnover	Triangular
4	RBO	Ratio of microbial to total organic C	0.02	soil carbon turnover	Triangular
5	SRB	Sulfate reducing bacteria	0.9	soil carbon turnover	Normal
6	krcv1	Specific decomposition rate residues, very labile	0.25	soil carbon turnover	Normal
7	krc1	Specific decomposition rate residues, labile	0.074	soil carbon turnover	Normal
8	krcr	Specific decomposition rate residues, resistant	0.02	soil carbon turnover	Normal
9	KRB	Rate of decomposition (fast decomposable microbes)	0.12	soil carbon turnover	Normal
10	hrb	Rate of decomposition (slow decomposable microbes)	0.04	soil carbon turnover	Triangular
11	EFFNO	Efficiency coefficient for resistant humus decomposition	0.2	soil carbon turnover	Triangular
12	KCI	Half-saturation value of soluble carbon	0.017	soil carbon turnover	Normal
13	KNI	Half-saturation value of nitrogen oxides	0.083	soil carbon turnover	Normal
14	FD	Ratio of denitrifiers to total microbial biomass	0.05	denitrification	Triangular
15	um_no3	Max. relative growth of NO <sub>3</sub> -denitrifiers	0.67	denitrification	Normal
16	um_no2	Max. relative growth of NO <sub>2</sub> denitrifiers	0.67	denitrification	Normal
17	um_no	Max. relative growth of NO denitrifiers	0.34	denitrification	Normal
18	um_n2o	Max. relative growth of N <sub>2</sub> O denitrifiers	0.34	denitrification	Normal
19	YMC	Max growth rate of denitrifiers on soluble carbon	0.503	denitrification	Normal
20	MC	Maintenance coefficient on carbon	0.0076	denitrification	Normal
21	m_no3	Maintenance coefficient on NO <sub>3</sub>	0.09	denitrification	Normal
22	ym_no3	Maximum growth rate on NO <sub>3</sub>	0.401	denitrification	Normal
23	R		0.29	denitrification	Normal
24	m_no2	Maintenance coefficient on NO <sub>2</sub>	0.349	denitrification	Normal
25	ym_no2	Maximum growth rate on NO <sub>2</sub>	0.428	denitrification	Normal
26	ym_no	Maximum growth rate on NO	0.151	denitrification	Normal
27	m_no	Maintenance coefficient on NO	0.0792	denitrification	Normal
28	ym_n2o	Maximum growth rate on N <sub>2</sub> O	0.151	denitrification	Normal
29	m_n2o	Maintenance coefficient on N <sub>2</sub> O	0.0792	denitrification	Normal
30	D_O2	O <sub>2</sub> -diffusion in air	0.07236	denitrification	Normal
31	K35	Nitrification rate at 35°C	25	nitrification	Triangular
32	QK	Crop maintenance respiration quotient	2	soil	Normal
33	RCNRVL	C/N ratio residue, very labile	5	soil	Normal
35	RCNR	C/N ratio residue, resistant	100	soil	Triangular
36	RCNB	C/N ratio microbial biomass	10	soil	Normal
37	RCNH	C/N ratio humus	10	soil	Normal
38	RCNM	C/N ratio humus	10	soil	Normal

### Conclusions

- Additional screening is done on 150 NCUs selected also for input-uncertainty analysis
- For further reducing uncertainty in simulating N and C turnover in agricultural soils at the regional scale, spatially explicit datasets of the most important parameters must be developed: Will it be possible?

### References.

Sobol' I. M. (1967). Distribution of points in a cube and approximate evaluation of integrals. U.S.S.R Comput. Math. Phys. 7: 86-112  
 Villa-Vialaneix N., Follador M., Ratto M. and Leip A. (2011). Metamodels comparison for the simulation of N<sub>2</sub>O fluxes and N leaching from corn crops. Environmental Modelling and Software submitted  
 Saltelli A., Annoni P., Azzini I., Campolongo F., Ratto M. and Tarantola S. (2010). Variance based sensitivity analysis of model output. Design and estimator for the total sensitivity index. Computer Physics Communications 181 (2): 259-270.