

# Process-Based Models for Estimating Nitrous Oxide Emissions in Agricultural Crop Production

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# Models to estimate N<sub>2</sub>O: Results of a bibliographic search

- Web of Science search
  - “denitrification models”: ~2,800 citations
  - “denitrification models” and “agriculture”: 131 citations
  - “((nitrous oxide) or (n2o))” and “models” and “agriculture”: 209 citations
- Process-based models identified based on “model\_name” and “((nitrous oxide) or (n2o))”
  - DNDC (Li et al. 1992): 139 citations
  - DayCent (Parton et al. 1996): 33 citations
  - *ecosys* (Grant et al. 2001): 23 citations
  - APSIM (Thorburn et al., 2010): 3 citations

## **N<sub>2</sub>O-emission features that we would like to capture with process-based models**

- Temporal trends
  - Interannual
  - Seasonal
  - Event-driven (e.g. fertilization)
- Spatial trends
  - Soil variability
  - Landscape controls
  - Cropping system – soil
  - landscape interactions
- N sources
  - Synthetic fertilizers
  - Organic amendments
  - Biological fixation
- N rates
- N timing
- N placement
  - Broadcast
  - Banding
- Nitrification inhibitors

## Objective

To review and exemplify process-based models for estimating nitrous oxide emissions in agricultural production systems

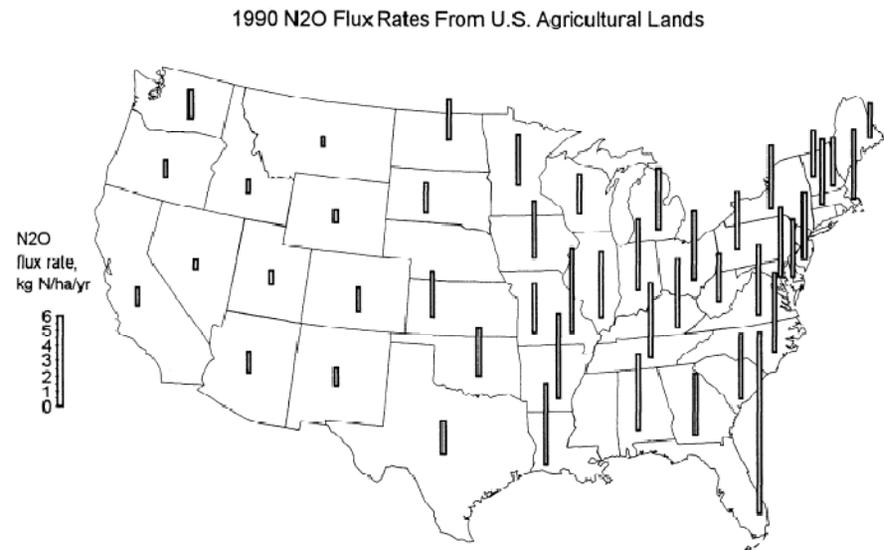
## Outline

- Review model features and provide examples for
  - DNDC
  - DAYCENT
  - *ecosys*
  - APSIM
  - EPIC with new denitrification submodel
- Summarize model features, performance, and applications

# DNDC, a biogeochemical model to simulate soil carbon dynamics and trace gases in agriculture

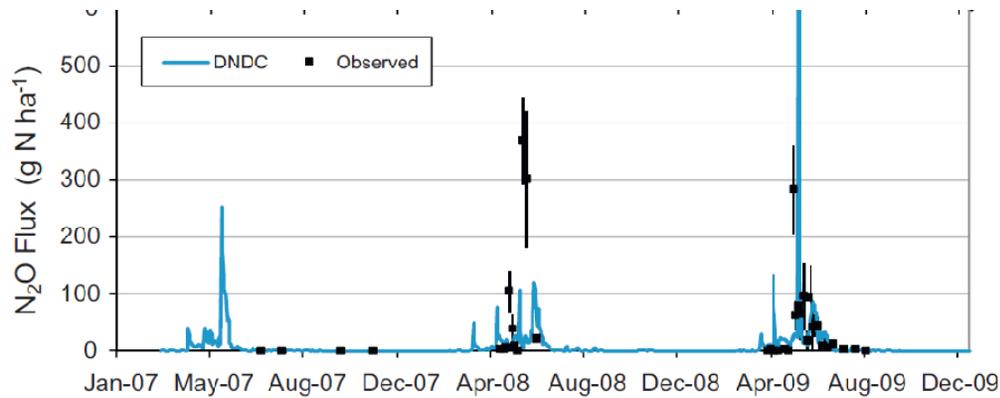
Li et al. (1992a,b) J. Geophys. Res. 97

- Denitrification in DNDC occurs under oxygen-deficient conditions (e.g., wet soils following rain events)
- Nitrates are converted to  $\text{NO}_2^-$  and then to  $\text{N}_2\text{O}$  and  $\text{N}_2$
- Nitrous oxide production and denitrification are functions of carbon decomposition, soil pH, soil water content, and soil temperature
- Uses of “anaerobic balloon” concept
- Li et al. (1996) produced generalized estimates of  $\text{N}_2\text{O}$  fluxes across U.S. agricultural lands

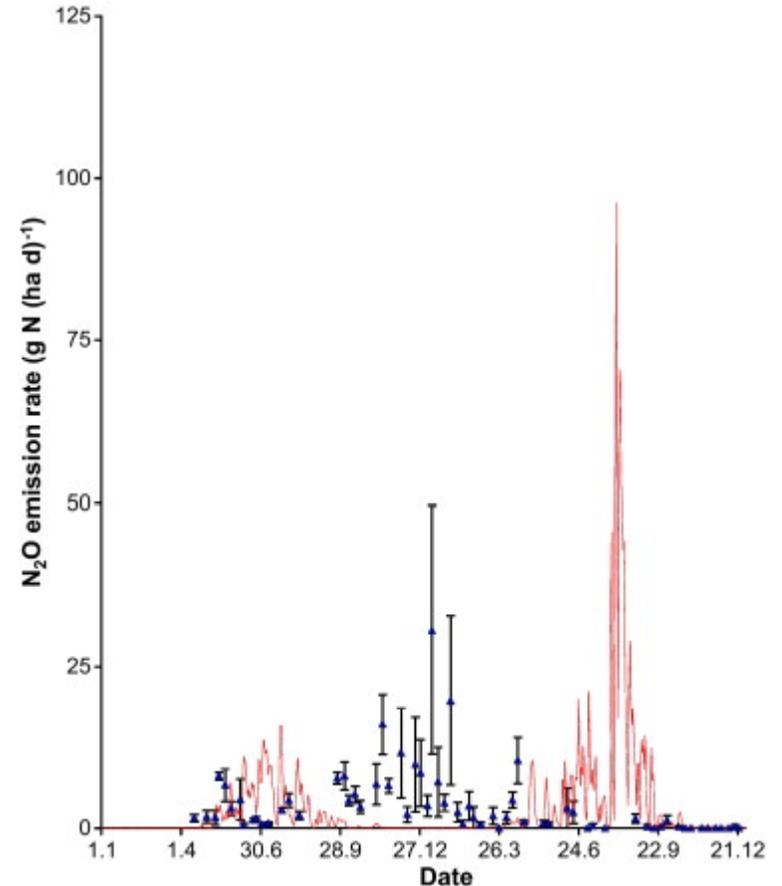


Li et al. (1996) Global Biogeochem. Cycles  
10:297-306

# Capturing temporal distribution of N<sub>2</sub>O fluxes with the DNDC model



DNDC-modeled (lines) and measured (symbols) N<sub>2</sub>O emissions from soils under reduced tillage in Italy (Lugato et al. 2011. *Agric. Ecosys. Environ.* 139:546–556)



DNDC-modeled (lines) and measured (symbols) N<sub>2</sub>O emissions from soils under conventional tillage in Germany (Ludwig et al. 2011. *Soil Tillage Res.* 112:114–121)

Year	Measurement period	Casselman <sup>a</sup>	Morewood <sup>a</sup>	DNDC <sup>b</sup>
		kg N <sub>2</sub> O-N ha <sup>-1</sup>		
2000	March 21–April 10	0.53	0.33	0.34
2001	March 19–April 27	0.55	0.52	0.76
2003	March 27–April 25 and May 15–June 12	1.87	1.34	1.44
2004	March 29–June 4	1.77	1.29	1.11

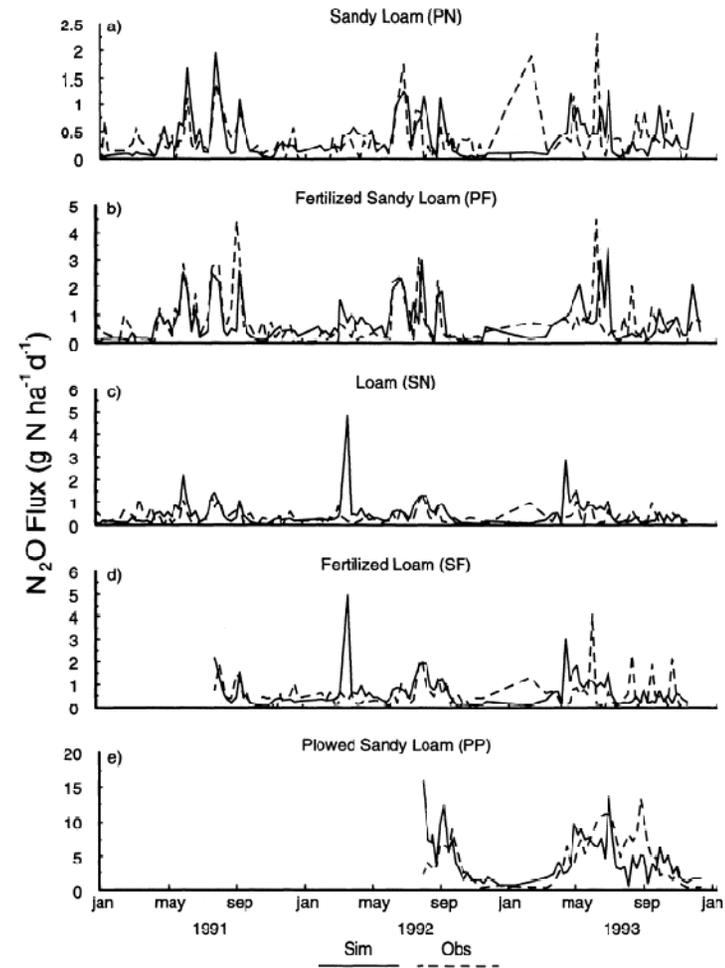
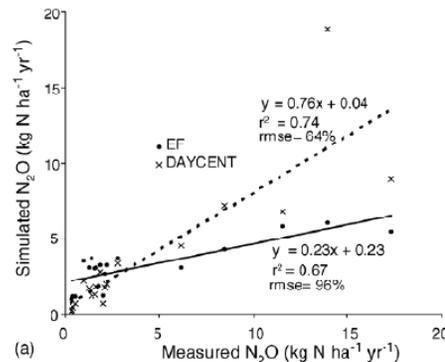
Aircraft-based measured and DNDC modeled N<sub>2</sub>O emissions in Canada (Desjardins et al. 2010. *Agric. For. Meteor.* 150:817–824).

# Modeling N<sub>2</sub>O and N<sub>2</sub> production generated from denitrification and nitrification process

Parton et al. (1996) *Global Biogeochem. Cycles* 10:401-412

- Daily time step process-based model developed on the basis of the Century model
- Models nitrification as a function of soil pH, soil water content, soil temperature, and soil NH<sub>4</sub><sup>+</sup> level
- N<sub>2</sub>O formation during nitrification is a direct function of nitrification rate
- N<sub>2</sub>O and N<sub>2</sub> formation during denitrification is modeled as a function of heterotrophic respiration, soil NO<sub>3</sub><sup>-</sup> level, and water-filled pore space (WFPS)

IPCC estimated and DNDC modeled comparisons against observed N<sub>2</sub>O emissions in 5 US states and 1 Canadian province (Del Grosso et al. 2005. *Soil Tillage Res.* 83:9–24).



Parton et al. (1996) *Global Biogeochem. Cycles* 10:401-412.

## Comparison of DAYCENT modeled and IPCC estimated global N<sub>2</sub>O emissions (Tg CO<sub>2</sub>eq) for corn, wheat, and soybean (Del Grosso et al. 2009)

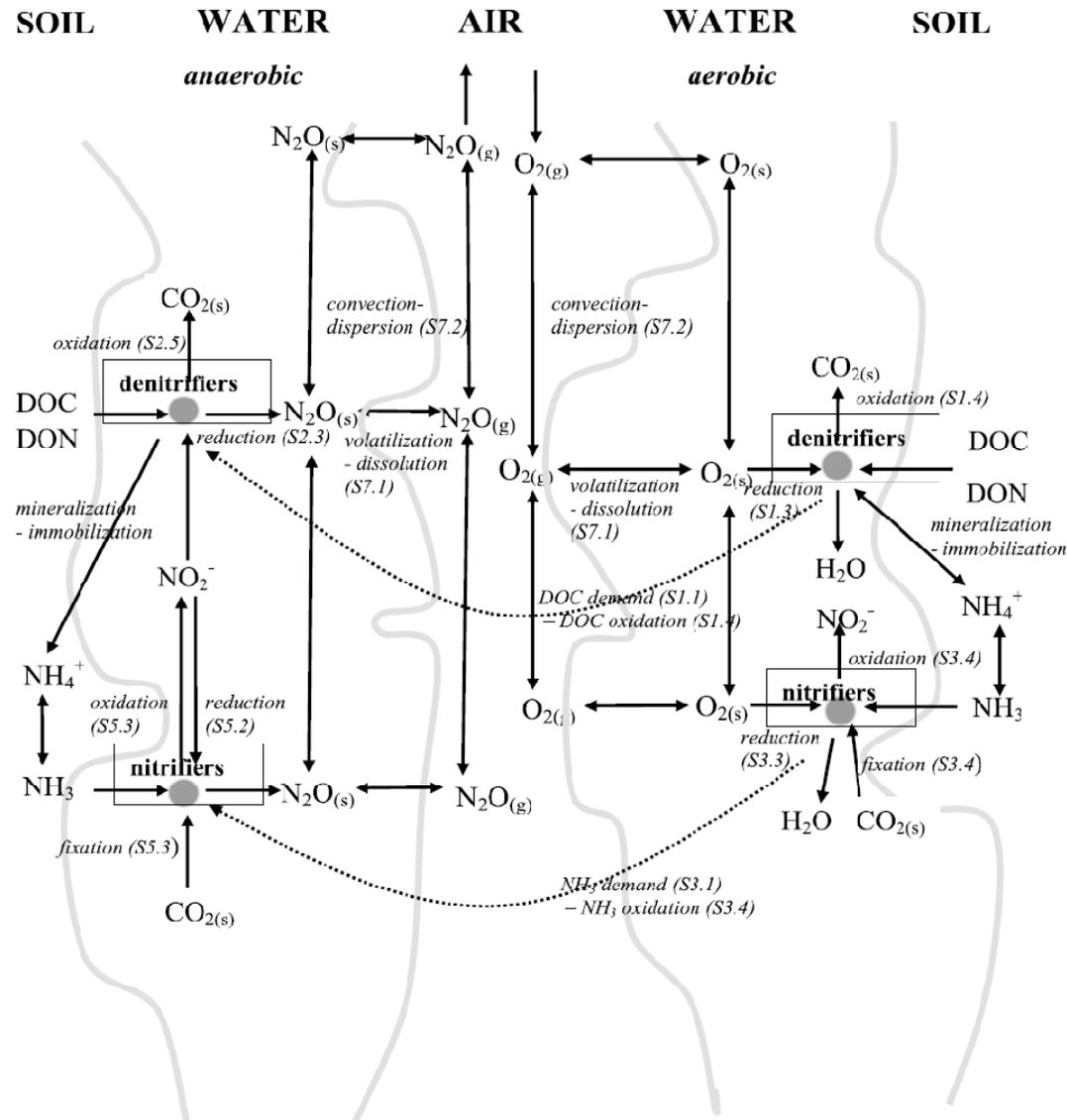
	N <sub>2</sub> O direct		N <sub>2</sub> O indirect		Total N <sub>2</sub> O		% delta total N <sub>2</sub> O (DAYCENT-IPCC)/ IPCC
	IPCC	DAYCENT	IPCC	DAYCENT	IPCC	DAYCENT	
<i>IPCC (1997) methodology</i>							
Corn	183	118	110	115	293	233	-20.6
Wheat	284	274	171	225	454	500	10.0
Soybean	119	38	8	36	127	73	-42.1
Sum	586	430	289	377	875	806	-7.8
<i>IPCC (2006) methodology</i>							
Corn	146	118	48	37	195	154	-20.7
Wheat	227	274	75	71	302	345	14.5
Soybean	36	38	9	12	46	50	8.8
Sum	410	430	132	120	542	549	1.4

## Modeled vs. observed growing season N<sub>2</sub>O emissions (kg N<sub>2</sub>O-N ha<sup>-1</sup>) at two sites in Canada

	Observed	DNDC	DAYCENT
<i>Quebec site</i>			
Fertilizer, 150 kg N	0.23	0.74	0.66
Pig slurry, 60 Mg	1.21	2.04	0.82
Pig slurry, 120 Mg	3.08	1.81	1.28
<i>Woodlsee site</i>			
Conv. tillage	1.03	0.86	0.57
No tillage	1.04	0.86	0.55
Zone tillage	0.92	0.96	0.54

Smith et al. 2008. Can. J. Soil Sci. 88:251-260

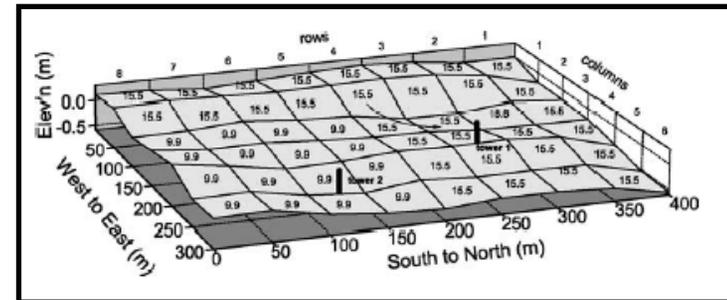
# Reactions, products, and gas transport in gaseous and aqueous phases in *ecosys* (Grant et al. 2001)



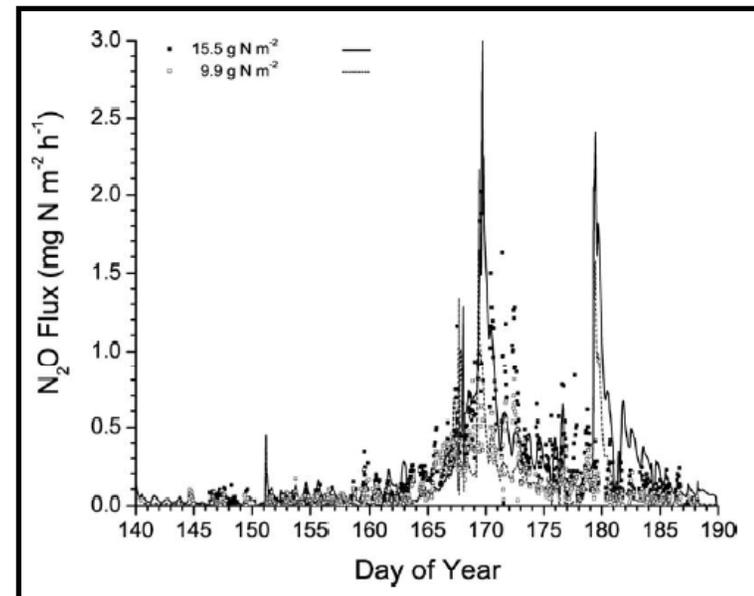
# Modeling N<sub>2</sub>O fluxes at the field scale with *ecosys*

Grant and Pattey. (2003) Soil Biol. Biochem. 35:225-243

- The model *ecosys* was run in 3D mode to simulate N<sub>2</sub>O fluxes from a fertilized field with topographic variations
- Modeled data were compared with field scale measurements made using eddy covariance towers and a tunable diode laser trace gas analyzer
- Large spatial and temporal variability of N<sub>2</sub>O emissions were modeled and measured
- Aggregation of N<sub>2</sub>O flux measurements to regional scales should be based upon
  - sub-daily measurements at representative landscape positions,
  - rather than upon less frequent measurements at individual sites



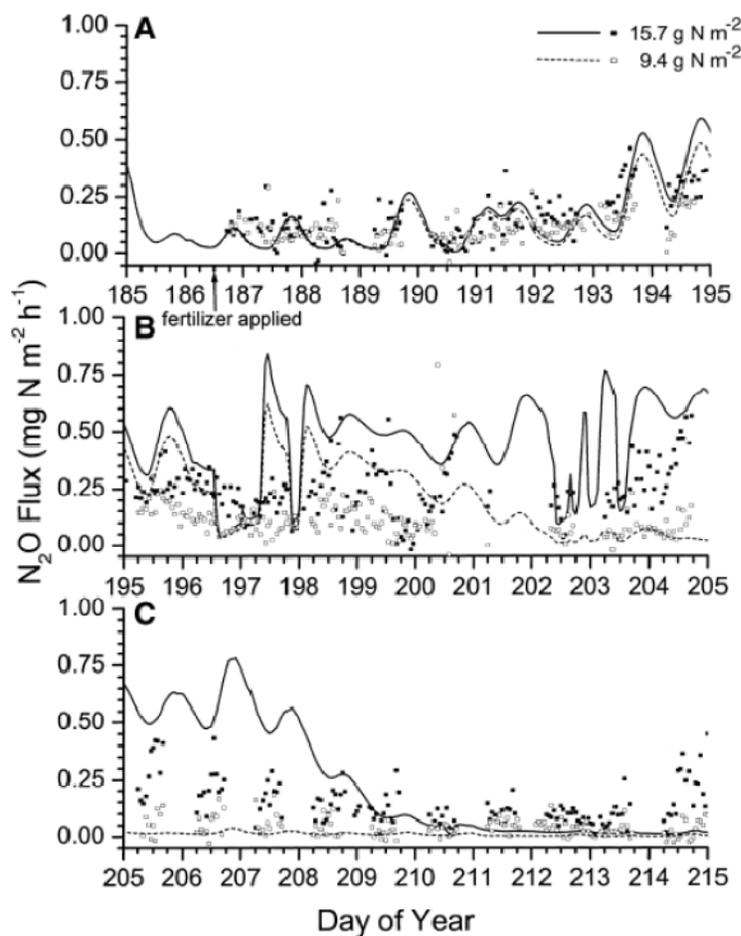
N application and TDL towers



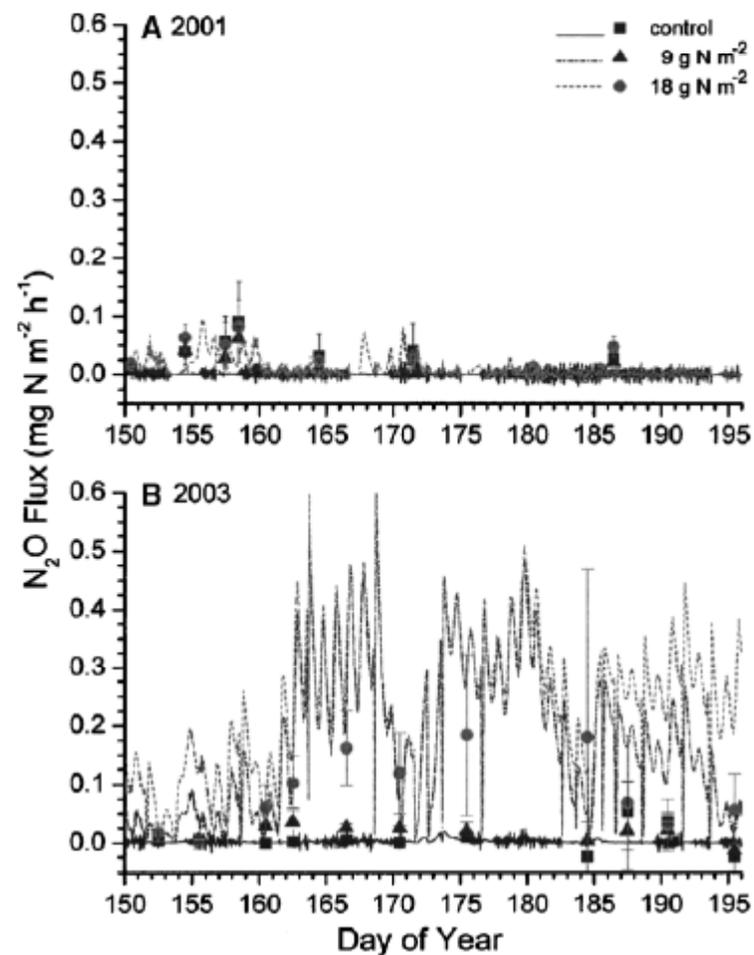
Observed (symbols) and modeled (lines) N<sub>2</sub>O fluxes

# Modeling effects of N rate on N<sub>2</sub>O flux with *ecosys*

## Ottawa, Ontario



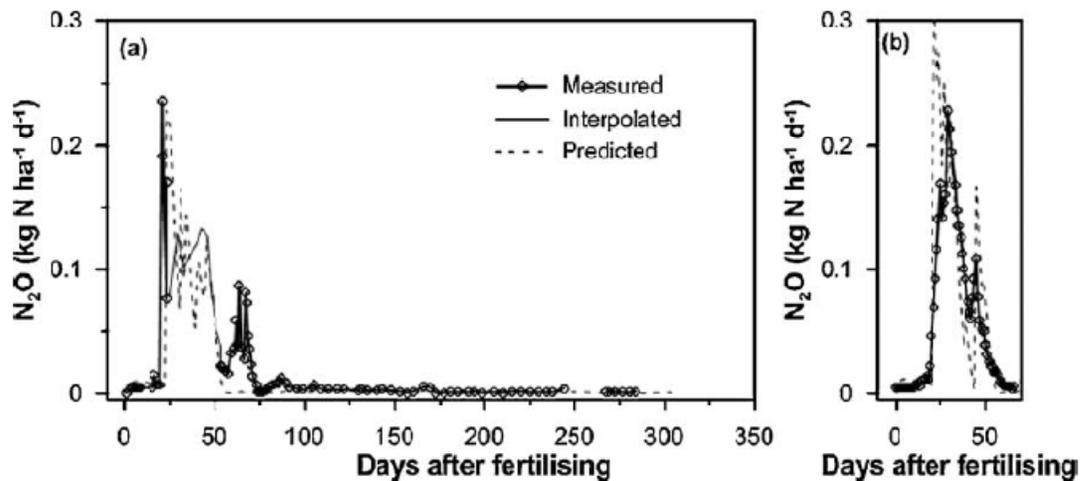
## Edmonton, Alberta



# Modeling N<sub>2</sub>O fluxes at the field scale with the APSIM model

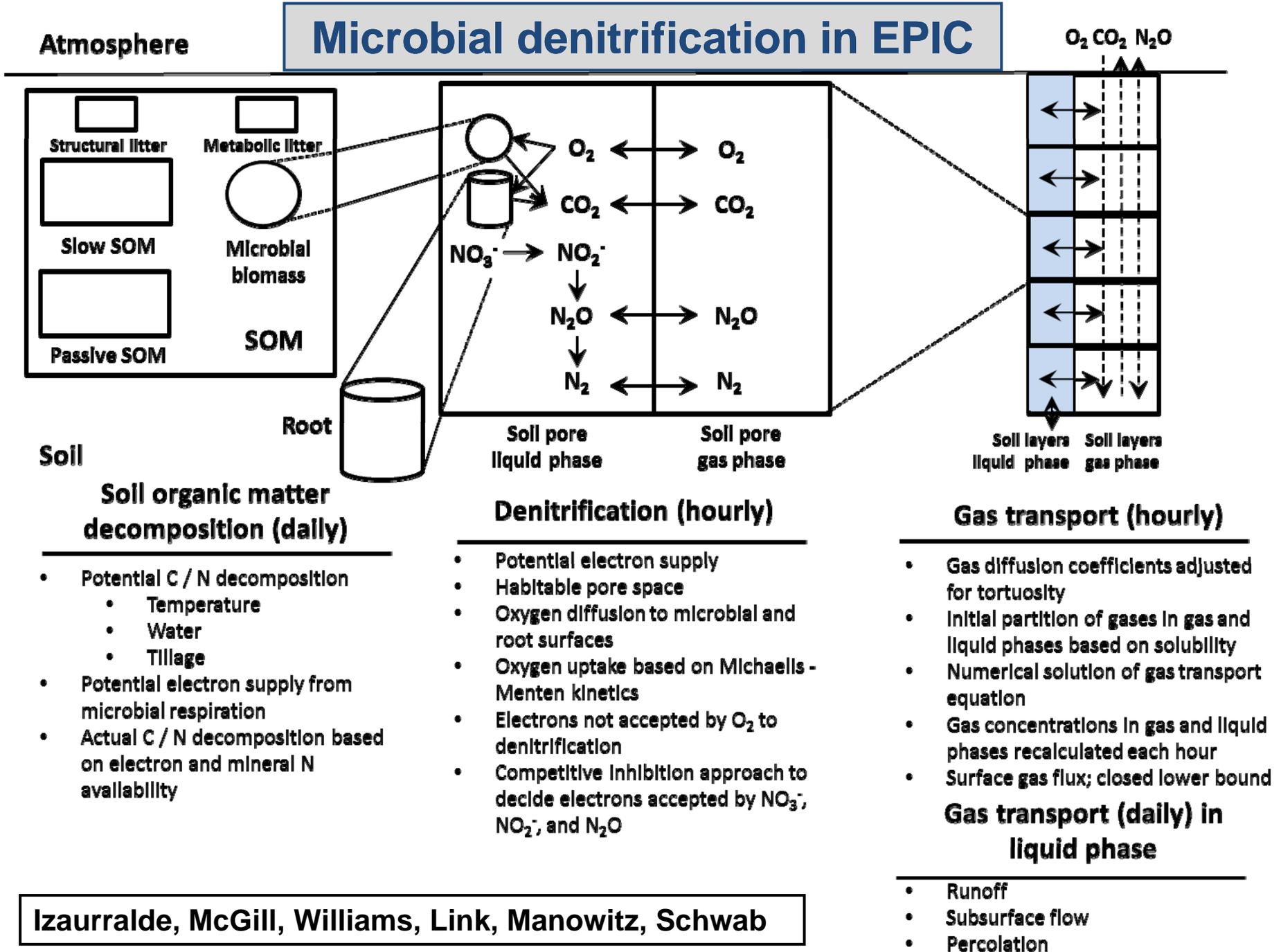
Thorburn et al. 2010. *Agric. Ecosys. Environ.* 136:343–350.

- Denitrification, a function of
- $R_{\text{denit},i} = k_{\text{denit}} \text{NO}_{3,i} C_{A,i} F_{\text{moist},i} F_{\text{temp},i}$
- N<sub>2</sub>O algorithms adapted from DAYCENT
- Tested under Australian conditions (sugarcane, subtropical cropping systems)



APSIM predicted and observed N<sub>2</sub>O emissions in two sugarcane crops in Australia (Thorburn et al. 2010. *Agric. Ecosys. Environ.* 136:343–350).

# Microbial denitrification in EPIC



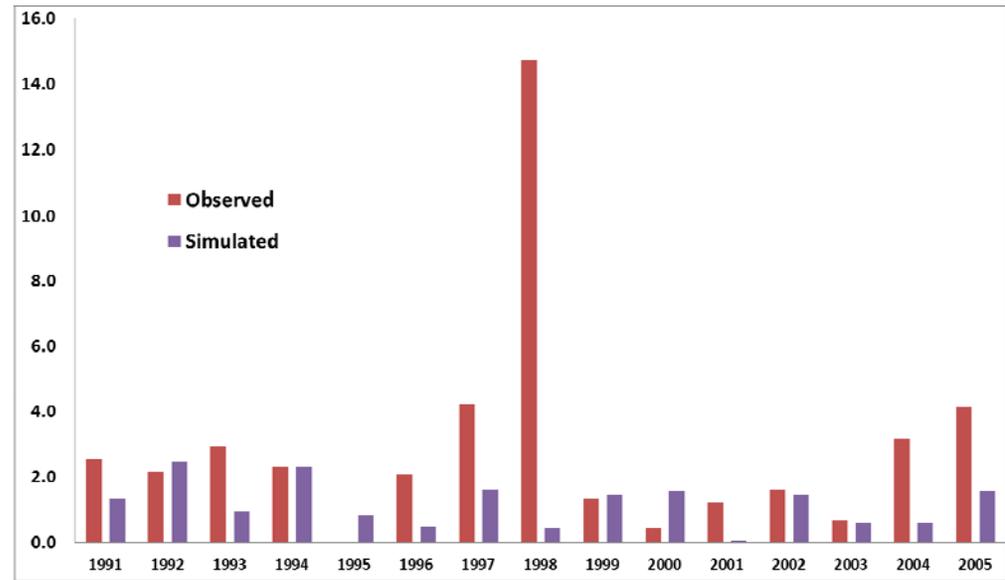
Izaurrealde, McGill, Williams, Link, Manowitz, Schwab

# EPIC-simulated vs. observed N<sub>2</sub>O flux in a corn-soy-wheat rotation at KBS, MI (g N<sub>2</sub>O-N ha<sup>-1</sup> d<sup>-1</sup>)

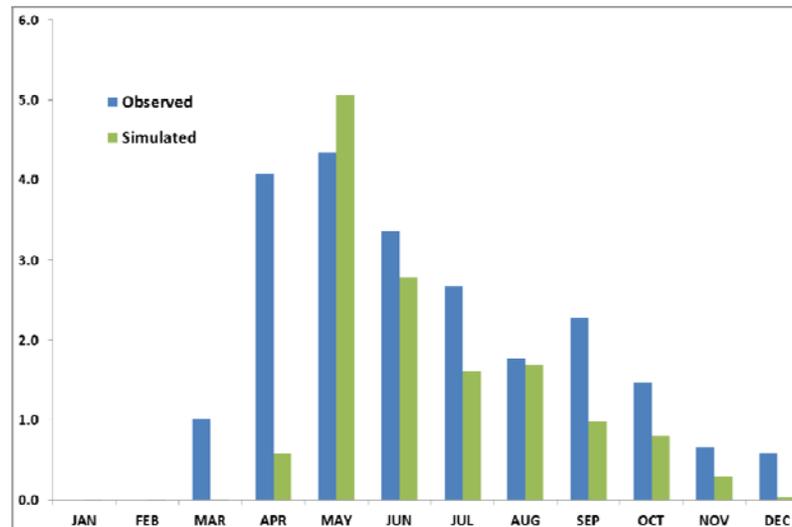
## KBS Plots



## Annual



## Seasonal



# Summary

- Models reviewed contain sufficient mechanistic-level representation to capture N<sub>2</sub>O dynamics in agriculture production as affected by
  - Cropping practices
  - Fertilizer rates
- Improvements needed on
  - Temporal resolution (annual, seasonal, daily)
  - Fertilizer placement and source
  - Nitrification inhibitors
- Opportunities for model intercomparisons like
  - Soil Organic Matter models – Rothamsted Workshop 1995
  - AgMIP (climate change) – ongoing

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