## **Supplementary Information**

## The optimum nitrogen fertilizer rate for maize in the US Midwest is increasing

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Table S1: Linear equations for each optimum nitrogen (N) rate and crop rotation used in Figs. 2 & 3.

 Table S2: Linear equations from Fig. 4.

Table S3: Experimental details of the 14 long-term trails.

**Table S4**: Yield response to nitrogen equations for calculating the agronomic and economic optimum Nrate.

Fig S1: Observed economic optimum nitrogen rate trends per location and crop rotation.

Fig S2: Pearson correlation of the economic optimum nitrogen rate to the explanatory variables in Fig. 4.

Fig S3: Comparison of USDA-NASS county average yields to experimental optimum yields.

Fig S4: The leaching cost effect on the optimum environmental nitrogen rate calculation.

Fig S5: Nitrogen losses (nitrate leaching and denitrification) per nitrogen rate and crop rotation.

Fig S6: Comparison of factors influencing the difference between the AONR and EONR.

Fig.S7: Comparison of factors influencing the difference between the EONR and EnvONR.

Fig S8: Conceptual figure of the risk associated with estimating the AONR past known N rates.

Fig S9: Comparison of annual average anhydrous ammonia fertilizer vs maize grain price.

**Fig S10**: One-to-one comparison of using a traditional fertilizer-to-grain price ratio to an adjusted price ratio.

**Fig S11**: Comparison of simulated and observed yield response to nitrogen per location and crop rotation.

## Supplementary Tables

**Table S1.** Linear equations for each optimum nitrogen (N) rate and crop rotation used in Figs. 2 & 3. In each equation the value of x = year, and the p value represents the significance of the slope.

Study	Optimum N rate	Crop rotation	Equation	P value of slope		
LTN	Agronomic optimum N rate (AONR)	Continuous Maize	y = 2.382x - 4567	0.0005		
	Economic optimum N rate (EONR)	Continuous Maize	y = 2.850x – 5522	<0.0001		
	Environmental optimum N rate (EnvONR)	Continuous Maize	y = 1.046x - 1981	0.062		
	Agronomic optimum N rate (AONR)	Maize-Soybean	y = 2.80x - 5457	<0.0001		
	Economic optimum N rate (EONR)	Maize-Soybean	y = 3.458x – 6782	<0.0001		
	Environmental optimum N rate (EnvONR)	Maize-Soybean	y = 2.863x - 5617	<0.0001		
Single year (Iowa)	Economic optimum N rate (EONR)	Continuous Maize	y = 0.444x - 709	0.70		
()	Economic optimum N rate (EONR)	Maize-Soybean	y = 2.215– 4312	0.01		
Single year (Illinois)	Economic optimum N rate (EONR)	Maize-Soybean	y = 3.780x - 7448	0.32		
LTN = Long-term Nitrogen trials (this study)						
Single year (Iowa) = Non-long-term N trials from the Nitrogen Rate Calculator						
Single year (Illinois) = Nafziger et al., (2022)						

Exploratory Variable	Crop rotation	Equation	P value of
			slope
Yield at Economic Optimum N rate (YEONR)	Continuous Maize	y=121.630x - 233920	<0.0001
Yield at Economic Optimum N rate (YEONR)	Maize-Soybean	y=155.184x – 300075	<0.0001
Yield at Zero N application (Y0)	Continuous Maize	y=-29.594x + 63082	0.13
Yield at Zero N application (Y0)	Maize-Soybean	y=-9.525x + 28554	0.72
Yield Response to N (YEONR-Y0)	Continuous Maize	y=151.224x - 297002	<0.0001
Yield Response to N (YEONR-Y0)	Maize-Soybean	y=164.709x - 325928	<0.0001
N Fertilizer use efficiency (YEONR – Y0)/EONR	Continuous Maize	y=0.442x - 854	0.01
N Fertilizer use efficiency (YEONR – Y0)/EONR	Maize-Soybean	y=0.483x – 939	0.004
N losses (NO <sub>3</sub> <sup>-</sup> leaching + $N_2O$ )	Continuous Maize	y=0.724x - 1427	0.02
N losses (NO <sub>3</sub> <sup>-</sup> leaching + $N_2O$ )	Maize-Soybean	y=0.374x – 735	0.03
Net Mineralization (0 N applied)	Continuous Maize	y=-0.288x + 638	0.33
Net Mineralization (0 N applied)	Maize-Soybean	y=0.217x - 343	0.51
kg <sub>N</sub> kg <sub>grain</sub> -1 (EONR/YEONR)	Continuous Maize	y=0.00004x-0.04	0.66
kg <sub>N</sub> kg <sub>grain</sub> -1 (EONR/YEONR)	Maize-Soybean	y=0.00007x-0.13	0.28
Grain N Export	Continuous Maize	y=0.869x - 1619	0.02
Grain N Export	Maize-Soybean	y=0.996x – 1867	0.01
Grain N Concentration	Continuous Maize	y=-0.006x + 14.1	0.09
Grain N Concentration	Maize-Soybean	y=-0.008x + 16.5	0.005
Precipitation (Growing Season)		y=9.630x – 18848	<0.0001

**Table S2**. Linear equations from Fig. 4, x = year. Statistical significance of the slope is measured using a p value less than 0.05.

lowa Locations (see Materials and Methods section Description of the long-term experiments)					
Location name	Latitude	Longitude	Study years	N rates	
				(kg N ha⁻¹)	
Ames, IA	42.01	-93.74	1999 - 2021	0, 68, 135, 203, 268	
Crawfordsville, IA	41.20	-91.49	1999 - 2021	0, 45, 90, 135, 180, 225, 268	
Kanawha, IA	42.91	-93.79	2005 - 2021	0, 45, 90, 135, 180, 225, 268	
Lewis, IA	41.33	-95.18	2001 - 2021	0, 45, 90, 135, 180, 225, 268	
Chariton, IA	40.97	-93.42	1999 - 2021	0, 45, 90, 135, 180, 225, 268	
Nashua, IA	42.94	-92.57	2005 - 2021	0, 45, 90, 135, 180, 225, 268	
Sutherland, IA	42.93	-95.54	2000 - 2021	0, 45, 90, 135, 180, 225, 268	
Brownstown, IL	38.95	-88.96	1999 - 2008	0, 50, 101, 151, 202, 252	
DeKalb, IL	41.84	-88.86	1999 - 2008	0, 50, 101, 151, 202, 252	
Dixon Springs Lowland, IL	37.46	-88.72	1999 - 2008	0, 50, 101, 151, 202, 252	
Dixon Springs Upland, IL	37.43	-88.66	1999 - 2008	0, 50, 101, 151, 202, 252	
Monmouth, IL	40.93	-90.73	1999 - 2008	0, 50, 101, 151, 202, 252	
Perry, IL	39.80	-90.82	1999 - 2008	0, 50, 101, 151, 202, 252	
Urbana, IL	40.08	-88.23	1999 - 2008	0, 50, 101, 151, 202, 252	

**Table S3.** Overview of the long-term location characteristics. All locations were comprised of both continuous maize and maize-soybean crop rotation. The years 2017-2019 were removed from the lowa Locations (see Materials and Methods section Description of the long-term experiments)

rate (AONR) and Economic optimum N rate (EONR) per site year and rotation combination				
Model	Equation	AONR	EONR	
Quadratic-plateau	y = a + bx + cx <sup>2</sup> , x < x <sub>o</sub> y = a + b x <sub>o</sub> + c x <sub>o</sub> <sup>2</sup> , x $\ge$ x <sub>o</sub>	-b/2c	pr-b/2c	
Quadratic	$y = a + bx + cx^2$	-b/2c	pr-b/2c	
Linear-plateau	$y = a + bx, x < x_o$ $y = a + b x_o, x \ge x_o$	Xo	If $b > pr$ , $x_0$ ; $b \le pr$ , 0	
Linear	y = a + bx	If $b > 0$ , mx; $b \le 0$ , 0	If $b > pr$ , mx; $b \le pr$ , 0	

**Table S4.** Equations used to calculate the yield (y) response to N (x) curves, the agronomic optimum N rate (AONR) and Economic optimum N rate (EONR) per site year and rotation combination

a = y-intercept

b = linear coefficient

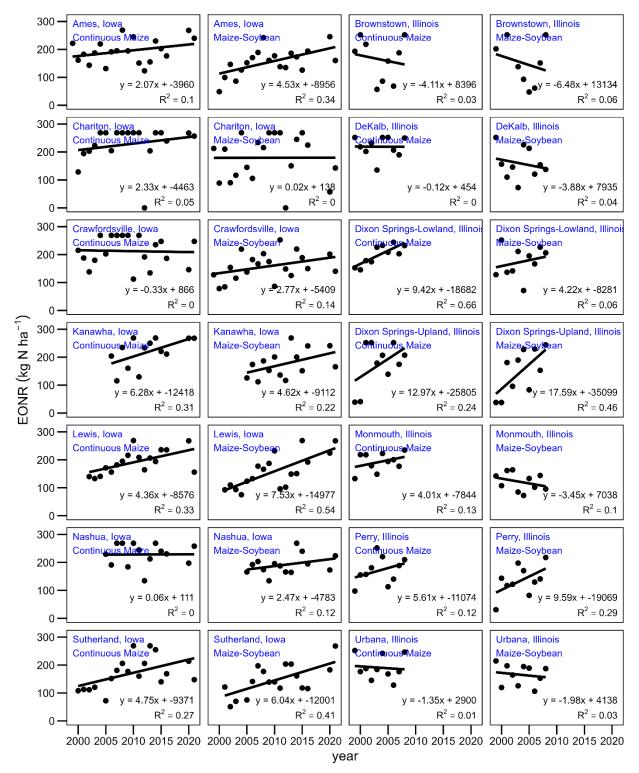
c = quadratic coefficient

 $x_0$  = inflection point

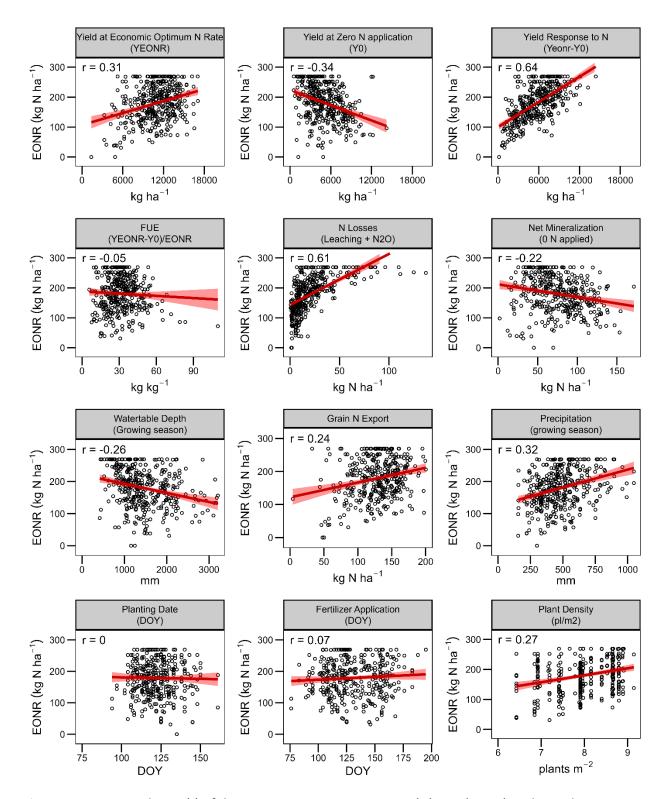
mx = maximum applied nitrogen rate per study

pr = price ratio 5.6:1 N fertilizer: maize price (US\$ 0.88 kg<sup>-1</sup>: US\$ 0.16 kg<sup>-1</sup>)

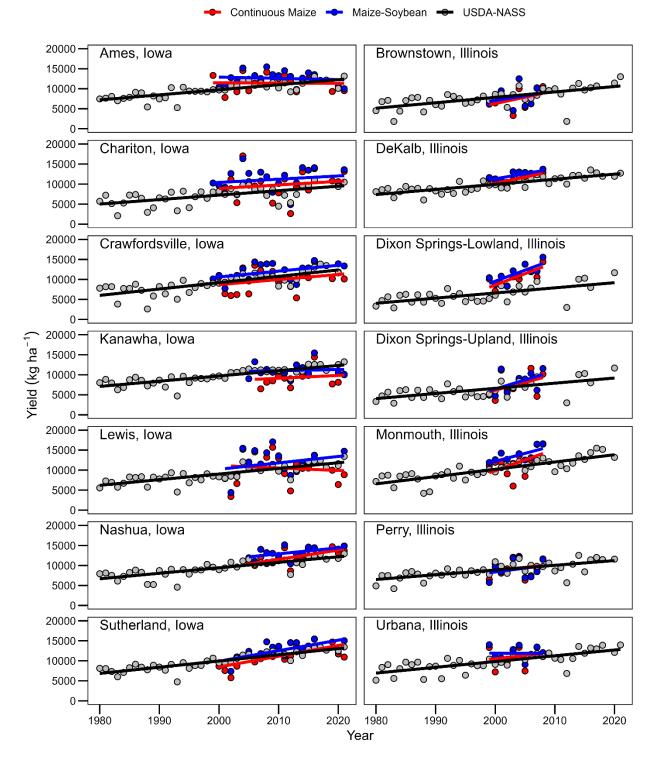
## **Supplementary Figures**



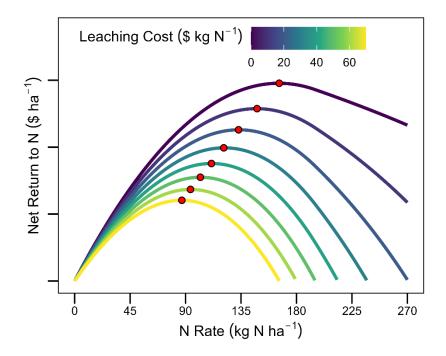
**Fig S1.** Trends of observed Economic Optimum Nitrogen (N) Rate (EONR) per location per continuous maize and maize-soybean crop rotations. The linear equation plus the R<sup>2</sup> value per panel are shown in the bottom right corner of each panel.



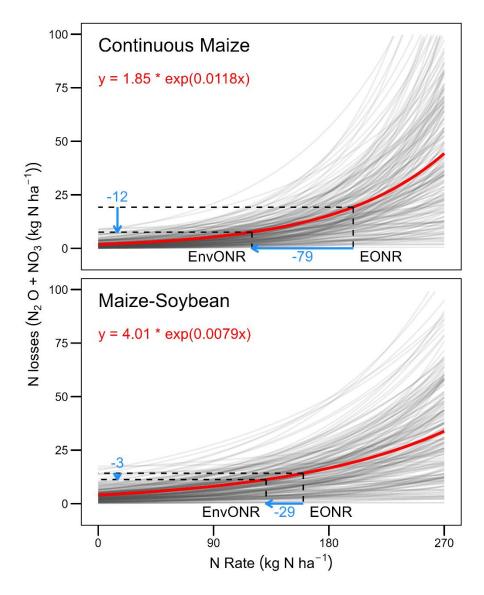
**Fig S2.** Pearson correlation (r) of the Economic optimum nitrogen (N) rate (EONR) to the explanatory variables. The shaded area represents a 95% confidence interval of the trendline.



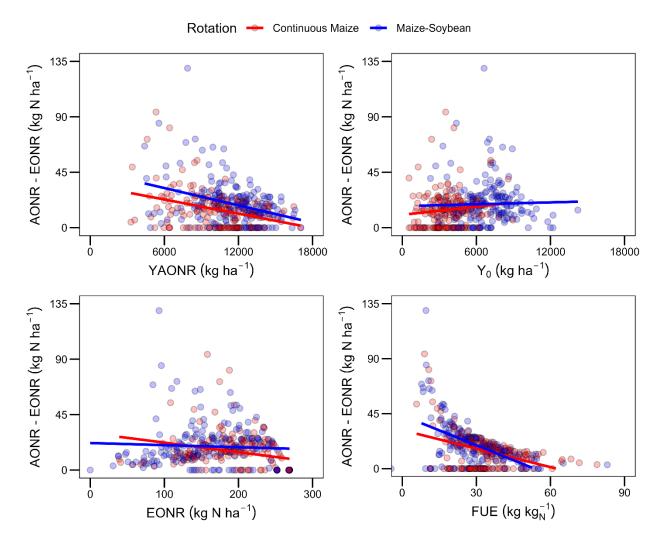
**Fig S3.** Long-term (1980-2021) county yields in Iowa and Illinois (*gray points*; USDA-NASS) compared to the annual values for the yield at the YAONR per crop rotation (*red* and *blue points* for continuous maize and maize-soybean, respectively).



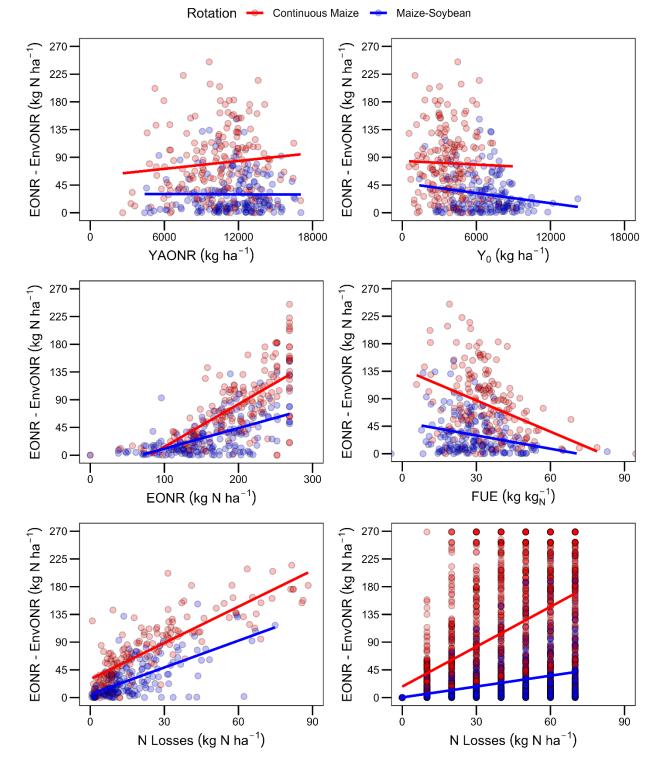
**Fig S4.** The effect of price associated per kg of nitrate  $(NO_3^{-})$  leaching on the Environmental optimum Nitrogen (N) rate (EnvONR). The *red* points represent the EnvONR, and the lines are the net return to applied N (the value of grain – the cost of fertilizer and  $NO_3^{-}$  leaching water quality social cost) per associated cost of nitrate leaching.



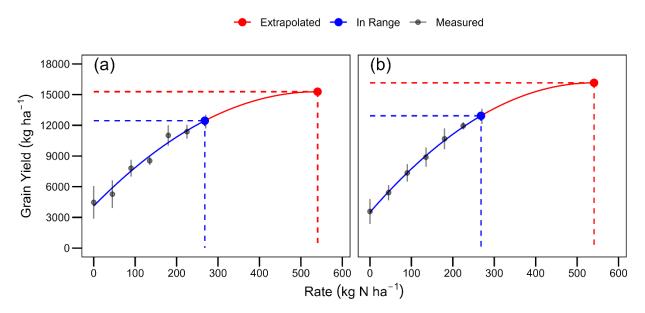
**Fig S5.** Simulated nitrogen (N) rate vs. total N loss relationship per crop rotation. The *red* and *gray* lines represent the best-fit curve through all the data, individual locations, and years. *Vertical* dashed lines represent the difference in N rates between the Economic Optimum N rate (EONR) and the Environmental Optimum N rate (EnvONR). The *horizontal* dashed lines show the difference in N losses between the EONR and EnvONR.



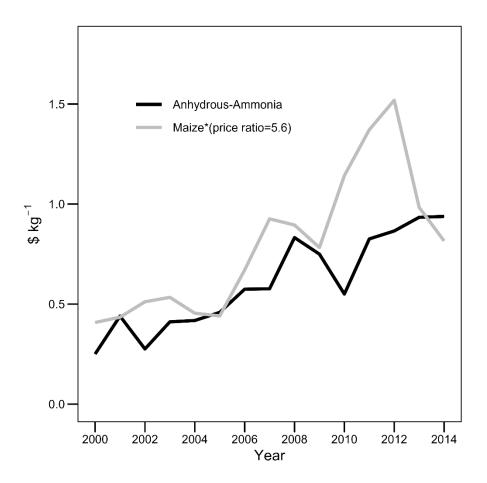
**Fig S6.** Comparison of factors influencing the difference between the agronomic and economic optimum N rate (AONR and EONR, respectively) per crop rotation. These factors include yield at the AONR (top left panel), yield at zero nitrogen application (top right panel), the EONR (bottom left panel), and the fertilizer use efficiency (bottom right panel).



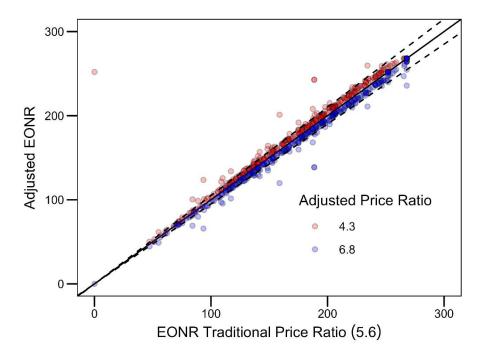
**Fig S7.** Comparison of factors influencing the difference between the economic and environmental optimum N rate (EONR and EnvONR, respectively) per crop rotation. These factors include the yield at the agronomic optimum N rate (top left panel), yield at zero N application (top right panel), EONR (middle left panel), fertilizer use efficiency (middle right panel), the sum of N losses at the EONR (i.e., nitrate leaching and  $N_2O$  emissions) (bottom left panel), and social cost of N losses (bottom right panel).



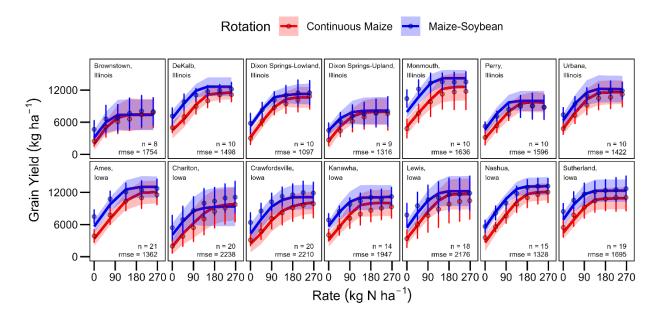
**Fig S8.** Conceptual figure depicting two examples of the risk in estimating the agronomic optimum N rate when extrapolating yield response functions past the known N rates. Examples are depicted from a continuous maize crop rotation for the site years of Crawfordsville 2004 (panel a) and Lewis 2010 (panel b). The vertical and horizontal dashed lines represent the agronomic optimum N rate and the yield associated with them used in this study (*blue line*) and extrapolated (*red line*).



**Fig S9**. United States Department of Agriculture estimates for annual maize grain and anhydrous ammonia fertilizer prices. Scaled maize grain price and anhydrous ammonia was adjusted by multiplying the maize grain price by the price ratio of 5.6 (price of anhydrous/grain).



**Fig S10.** One-to-one comparison of using a traditional fertilizer to grain price ratio (i.e., 5.6) to an adjusted price ratio. The solid *black* line represents the one-to-one line between the EONR given the traditional and the adjusted price ratios, whereas the dashed lines represent a  $\pm$ 5% change from the one-to-one line.



**Fig S11**. Measured (*points ± standard deviation bars*) and APSIM model simulated (*lines*) yield response to N fertilizer. Data are averaged across all years per location and rotation. The shaded region represents the mean simulated yield ± standard deviation. Source: Baum et al. (2023). The amount of years compared per site and rotation is denoted by n within each panel.