

# Impact of uncertainty on the optimum nitrogen fertilization rate and agronomic, ecological and economic factors in an oilseed rape based crop rotation

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## SUMMARY

Crop yield and optimum nitrogen fertilization rates (Nopt) are often calculated *ex post* by specific functions of the nitrogen fertilization rate, but in doing this, uncertainties in terms of model choice, annual nitrogen response variations and parameter estimation are neglected. In the present study, Nopt, grain yields, net revenues and N balances were estimated for the three crops of an oilseed rape (OSR)–winter wheat–winter barley rotation. The effects of uncertainties were considered using three different statistical models, estimating an identical Nopt over the years and carrying out Monte-Carlo simulations where model parameters were varied according to their estimated standard errors. The statistical models used were the quadratic (Q) polynomial function, the linear response and plateau (LRP) function and the quadratic response and plateau (QRP) function.

The Q model tended to estimate the highest Nopt values for the three crops, followed by the QRP and the LRP model in an initial *ex post* analysis. The highest corresponding mean net revenues in the rotation were estimated by the LRP model, followed by the Q and QRP model; mean N balances increased in the order LRP, QRP and Q. In the comparison of the crops, OSR showed the highest N balances followed by wheat and barley. Considering the protein concentration in wheat, Nopt values estimated by the Q model were considerably higher than without the economic effects of grain quality.

In order to consider uncertainties in annual nitrogen response, an *ex ante* Nopt over the years was determined by maximizing the cumulated net revenues over all years in the rotation. *Ex ante* Nopt was higher as the mean of the *ex post* Nopt values for the QRP and LRP model. Average grain yields and net revenues were lower, N balances were higher. Running the Monte-Carlo simulations, *ex post* Nopt was obtained by 10 000 generated functions in each year and *ex ante* Nopt by 50 000 generated functions of years 1996, 1997, 1998, 1999 and 2002. This led to an increase in Nopt especially for the LRP model, while effects on the estimation of Nopt by the Q model were rather small. For the LRP model, corresponding mean net revenue decreased and mean N balance rose. In contrast, due to marginal changes in Nopt, the consideration of uncertainties in the estimations had only a small effect on net revenue and N balance in the Q model.

In general, all kinds of uncertainty tended to increase Nopt but this effect was much higher for the LRP model as compared to the Q model. This increase in Nopt was associated with decreasing net revenues and increasing N balances. Exceptionally in OSR using the Q model, however, the *ex ante* approaches considering uncertainty led to slightly lower Nopt values compared to the *ex post* value.

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## INTRODUCTION

Fertilizer recommendations have to take rising economic and, particularly, ecological concerns into account. Therefore, the exact estimation of optimum nitrogen fertilization rates (Nopt) for arable crops become increasingly important. Most commonly, Nopt is estimated from results of field experiments where crop yield is calculated *ex post* as a function of the nitrogen fertilization rate. In many cases, the estimated parameters are used for calculating *ex ante* nitrogen fertilization recommendations. It is, however, well known that the selection of the statistical model describing the yield response to nitrogen fertilization can considerably affect estimated Nopt (Bock & Sikora 1990; Cerrato & Blackmer 1990; Bullock & Bullock 1994; Colwell 1994; Bélanger *et al.* 2000). Furthermore, the *ex post* determination of optimum fertilization rates does not consider the inevitable uncertainty resulting from year-to-year and site-to-site variations in weather and soil conditions. Since farmers do not know weather conditions in advance when making their fertilizing decision it can be assumed that, in practice, they would use an identical N amount each year to adapt to annual nitrogen response variations.

The aim of the present study was to quantify the impact of yield models' functional forms, *ex post v. ex ante* recommendations and uncertainty in model parameter estimation on fertilization recommendations. Therefore, three kinds of uncertainty in the estimation of Nopt and corresponding grain yields, net revenues as well as N balances, were analysed in an oilseed rape (OSR)–wheat–barley rotation. Firstly, the uncertainty of model choice was analysed by estimating Nopt using three different statistical models. Secondly, year-to-year variation in nitrogen response was investigated by calculating a Nopt where the total net revenue over the years was maximum in each crop. This is called the *ex ante* approach; however, our dataset was too small to validate the *ex ante* Nopt on independent data. Finally, a Monte-Carlo simulation was performed to quantify the effect of uncertainty on the estimation of model parameters.

## MATERIALS AND METHODS

### Field experiment

The experimental data presented here originate from a field trial established in autumn 1990 on a pseudogley Luvisol of sandy loam texture at the Hohenschulen Experimental Farm of the University of Kiel (10.0°E, 54.3°N, 30 m asl), located *c.* 15 km west of Kiel, Schleswig-Holstein, NW Germany. Total rainfall averages 750 mm annually at the experimental site, with *c.* 400 mm received during April–September, the main growing season, and *c.* 350 mm during October–March. Further details of

the experiment were previously reported by Sieling *et al.* (1997).

In the present study, a dataset from 1996 to 2002 was used. In 2000 and 2001, nitrogen concentration data of OSR were missing. The experiment comprised the rotation OSR (cv. Falcon), winter wheat (cv. Orestis) and winter barley (cv. Alpaca). All plots were ploughed. Fungicides and other crop management factors (e.g. herbicides, seed date) were handled in accordance with the farmers' normal practice. Mineral N fertilization (0–280 kg N/ha) was applied three times (at the beginning of spring growth, at stem elongation and at ear emergence for wheat and barley and at the beginning of spring growth, at stem elongation and at bud formation for OSR) as calcium ammonium nitrate (0.27 kg N/kg fertilizer). The first and the second application rate varied from 0 to 120 kg N/ha, the third from 0 to 80 kg N/ha each in increments of 40 kg N/ha. In total, there were 32 different N treatments. Pig slurry was applied to half of the OSR plots in spring (80 kg total N/ha), while the other half received only mineral N fertilizer. It was assumed that 0.75 of the total N was NH<sub>4</sub>-N and so 60 kg N/ha was available for the crop. Only total N amounts were included in the calculations; application times and rates of distribution were disregarded. The plot size was 7 × 3 m. At crop maturity, an area of 6.75 m<sup>2</sup> was harvested by combine and yield was standardized to a dry matter content of 0.86 for wheat and barley and 0.91 for OSR. The N uptake by the grain was obtained by multiplying the grain dry matter by the grain N concentration, determined with near infrared spectroscopy (NIRS 5000, Foss). N-balances (kg N/ha) were calculated as applied fertilizer N (kg N/ha) minus N-offtake by the grain (kg N/ha).

### Statistical analyses

Nopt was estimated by three different methods (*ex post*, *ex ante* and Monte-Carlo simulation). The different underlying yield response functions to nitrogen fertilization (linear response and plateau (LRP), quadratic response and plateau (QRP), quadratic (Q)) are described by three statistical models, which were fitted to the dataset of each crop (OSR, wheat, barley) using proc REG and proc NLIN of the SAS Software package (SAS Institute Inc. 1989). Additionally, the influence of quality payments for wheat protein concentration was analysed.

The LRP model is specified by three parameters:

$$\begin{aligned} Y &= a + bX + \varepsilon & \text{if } X < C \\ Y &= P + \varepsilon & \text{if } X \geq C \end{aligned} \quad (1)$$

where  $Y$  is the grain yield (t/ha),  $X$  the application rate of N (kg N/ha),  $a$  the intercept  $b$  the linear coefficient and  $\varepsilon$  the error term.  $C$  is the nitrogen

application rate at the intersection of the linear model and the plateau,  $P$  describes the plateau yield.

The QRP model is specified by four parameters:

$$\begin{aligned}
 Y &= a + bX + cX^2 + \varepsilon & \text{if } X < C \\
 Y &= P + \varepsilon & \text{if } X \geq C
 \end{aligned}
 \tag{2}$$

where  $Y$  is the grain yield (t/ha),  $X$  the application rate of N (kg N/ha),  $a$  the intercept,  $b$  the linear,  $c$  the quadratic coefficient and  $\varepsilon$  the error term.  $C$  is the nitrogen application rate at the intersection of the quadratic model and the plateau,  $P$  describes the plateau yield. In order to ensure a smooth derivative function, the additional side condition  $dY/dX=0$  at  $X=C$  is introduced.

The Q model is specified by three parameters:

$$Y = a + bX + cX^2 + \varepsilon \tag{3}$$

where  $Y$  is the grain yield (t/ha),  $X$  the nitrogen application rate (kg N/ha),  $a$  the intercept,  $b$  the linear,  $c$  the quadratic coefficient and  $\varepsilon$  the error term.

Adjusted coefficients of determination (adj.  $R^2$ ) considering the different number of function parameters were determined using regression analyses for the Q model. For the LRP and the QRP models, adj.  $R^2$  was calculated by the analysis of variance routine on the SAS output:

$$\text{adj. } R^2 = 1 - (1 - R^2) \frac{n - 1}{n - k - 1} \tag{4}$$

where  $n$  is the number of observations and  $k$  the number of variables.

The years 2000 and 2001 were omitted from calculations for the whole rotation because of the missing nitrogen concentration data for OSR.

Nopt was defined as the rate at which maximum economic returns were produced (Colwell 1994), calculated by marginal value product = marginal factor cost = nitrogen price for the QRP and the Q model.

The parameter estimates obtained were used for different approaches to estimate Nopt, grain yield at Nopt and the corresponding economic net revenues and N balances. At first an *ex post* analysis was made, i.e. Nopt was estimated for the three crops within the rotation and the different models in each year. Secondly, an *ex ante* Nopt for all analysed years and each crop was estimated by maximizing the objective function:

$$\text{Max } \sum_{i=1}^I (pwY_i(N) - pnN) \tag{5}$$

where  $Y_i(N)$  is the response function in year  $i$ ,  $I$  is the total number of years,  $pw$  is the price of the crop and  $pn$  the price of nitrogen fertilizer (Bullock & Bullock 1994). A numerical solution of this function was calculated using the Newton method provided by the solver procedure of Microsoft Excel®.

In order to consider the uncertainties in the model parameter estimations, Monte-Carlo simulations were carried out. After testing the residuals of the regression models for normality, a normal distribution of the model parameters was assumed, characterized by the mean and the standard deviation of the parameters. For each year, 10 000 random combinations of the model parameters were generated assuming a multivariate normal distribution with correlated variables by using the Cholesky decomposition of the correlation matrix (Greene 2003). First, to consider uncertainties in an *ex post* analysis, Nopt was obtained separately for each random draw. Second, the *ex ante* Nopt was calculated by maximizing the mean economic net revenue of all 50 000 response functions generated for the years 1996, 1997, 1998, 1999 and 2002.

Market prices were assumed to be 0.6 €/kg N, 200 €/t OSR, 100 €/t wheat and 90 €/t barley.

In order to consider the effect of the N application rate on quality parameters, Nopt for wheat was also estimated regarding protein concentration and grain yield. For this purpose the Q model and an empirical function relating the grain protein content to the nitrogen application rate and the yield level was used:

$$\text{Prot} = a + bX + cY + \varepsilon \tag{6}$$

where Prot is the protein concentration (mg/g),  $X$  the nitrogen application rate (kg N/ha),  $Y$  the grain yield (t/ha)  $a$  the intercept,  $b$  and  $c$  the linear coefficients and  $\varepsilon$  is the error term. The impact of protein concentration on net revenues were defined according to Baker *et al.* (2004) by Eqn (7):

$$\text{NR} = (Ypw) - (Npn) + ((P - 115)5Y) \tag{7}$$

where NR is the net revenue (€/ha),  $Y$  the grain yield (t/ha),  $N$  the nitrogen application rate (kg N/ha),  $P$  the protein concentration (mg/g),  $pw$  the market price for wheat at 115 mg/g protein concentration,  $pn$  the N fertilizer price (0.6 €/kg N) and 5 the premium or discount for protein concentration (€/t).

## RESULTS

### Statistical features

As an example for the common *ex post* analysis, the application of the statistical models for yields of OSR in 2002 is shown in Fig. 1 while Fig. 2 gives the corresponding regression residuals. The model outcomes resulted in different values for Nopt (160 kg N/ha (LRP), 192 kg N/ha (QRP) and 217 kg N/ha (Q)).

Parameters of all model fits are given in Tables 1–3. The differences in the adj.  $R^2$  values for grain yield between the models for a given crop and year were rather small. Also, differences between the intercepts

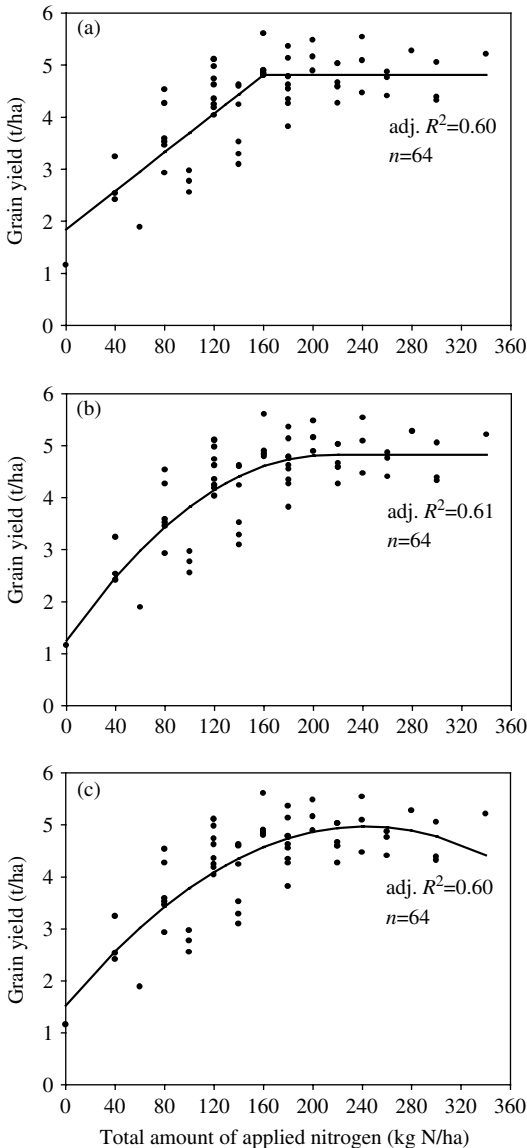


Fig. 1. OSR yield response to N fertilization in 2002 described using (a) the LRP model, (b) the QRP model and (c) the Q model.

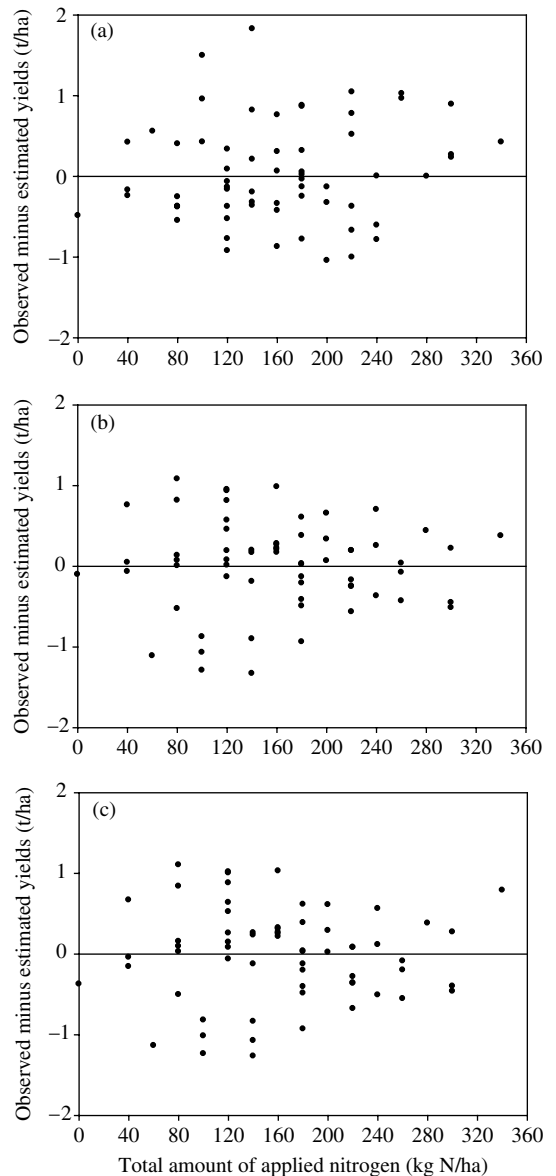


Fig. 2. Residuals of the regression (observed yield minus estimated yield) when (a) the LRP model, (b) the QRP model and (c) the Q model were fitted to yield data of OSR v N fertilization in 2002.

of the QRP and the Q model were marginal, but the LRP model estimated higher yields without fertilization. Differences in the intercept between the years, i.e. different weather and soil conditions, were considerable. The intercept estimated by the Q model varied from 2.74 to 7.08 in wheat, indicating a variable N availability from natural sources between the years. Analysis of variance showed that all model fits

were significant ( $P < 0.05$ ), except the QRP model in barley in 1998 ( $P = 0.0567$ ) (data not shown). According to a Shapiro–Wilk test ( $P = 0.05$ ; Thode 2002), the residuals of the Q model were normally distributed in 16 of 19, 15 of 19 and 14 of 19 crop and year combinations for the Q, LRP and QRP model respectively (data not shown).

Table 1. Intercept (a), linear coefficient (b), adj. R<sup>2</sup>, C, P, RMSE (root mean square error) and n of the LRP model (S.E. ±)

Crop	Year	a	b × 10 <sup>-2</sup>	C (kg N/ha)	P (t/ha)	adj. R <sup>2</sup>	RMSE	n
OSR	1996	1.58	1.50 (0.003)	165 (14.3)	4.06 (0.116)	0.48	0.62	64
	1997	2.82	0.95 (0.005)	137 (36.6)	4.12 (0.131)	0.11	0.84	63
	1998	2.67	1.38 (0.002)	220 (20.1)	5.71 (0.214)	0.56	0.71	64
	1999	1.36	1.37 (0.002)	188 (11.6)	3.94 (0.102)	0.64	0.45	63
	2002	1.84	1.86 (0.003)	160 (12.5)	4.81 (0.099)	0.60	0.58	64
Winter wheat	1996	6.92	2.14 (0.007)	106 (19.5)	9.19 (0.134)	0.43	0.63	32
	1997	5.19	2.80 (0.010)	135 (23.7)	8.98 (0.320)	0.31	1.36	32
	1998	4.53	3.83 (0.011)	88 (11.9)	7.92 (0.191)	0.41	0.90	32
	1999	4.26	3.99 (0.009)	151 (16.5)	10.28 (0.323)	0.59	1.16	31
	2000	4.58	3.84 (0.006)	131 (10.2)	9.61 (0.240)	0.70	0.86	32
	2001	3.58	6.42 (0.016)	93 (12.4)	9.56 (0.396)	0.57	1.37	22
	2002	2.83	4.03 (0.005)	134 (9.4)	8.24 (0.220)	0.78	0.79	31
Winter barley	1996	3.94	2.14 (0.009)	108 (24.6)	6.25 (0.165)	0.34	0.77	32
	1997	3.27	2.50 (0.010)	122 (23.5)	6.32 (0.322)	0.20	1.36	32
	1998	4.66	3.89 (0.031)	62.9 (30.2)	7.10 (0.210)	0.13	1.08	31
	1999	3.65	4.06 (0.015)	92 (16.9)	7.38 (0.273)	0.28	1.28	32
	2000	3.77	2.97 (0.005)	136 (13.2)	7.80 (0.230)	0.63	0.83	32
	2001	5.82	4.11 (0.011)	102 (14.4)	10.00 (0.204)	0.52	0.96	32
	2002	2.46	3.91 (0.006)	138 (12.0)	7.87 (0.269)	0.69	0.97	32

Ex post *Nopt*

The Q model estimated the highest *ex post* *Nopt* values for all years and crops except for OSR in 1999, the LRP model the lowest *Nopt* (Table 4). Mean *Nopt* values increased by *c.* 30 kg N/ha from the LRP to the QRP model in wheat and barley and *c.* 60 kg N/ha in OSR. The QRP model differed from the Q model by *c.* 30 kg N/ha in wheat, *c.* 20 kg N/ha in barley and *c.* 10 kg N/ha in OSR (Table 4). The Q model estimated slightly higher grain yields at *Nopt*, compared to the QRP and LRP model which gave quite similar results for all crops. Between the years, estimated *Nopt* and corresponding grain yields differed considerably. In wheat, the estimated

*Nopt* was in the range 135–220 kg N/ha for the Q model, 117–178 kg N/ha for the QRP model and 88–151 kg N/ha for the LRP model (Table 4). The highest net revenues were calculated by the LRP model, followed by the Q and QRP model. Mean N balance values in OSR were up to 105 kg N/ha when *Nopt* was estimated by the Q model, followed by the QRP model (101 kg N/ha) and the LRP model (52 kg N/ha). The lowest N balances which were even negative in winter wheat and winter barley were calculated by the LRP model in all three crops. Regarding the rotation these negative N balances were levelled out by the positive N balance of OSR. Within the crops N balances decreased in the order OSR, wheat, barley. In particular N

Table 2. Intercept (a), linear coefficient (b), quadratic coefficient (c) adj. R<sup>2</sup>, C, P, RMSE and n of QRP model (S.E. ±)

Crop	Year	a	b × 10 <sup>-2</sup>	c × 10 <sup>-5</sup>	C (kg N/ha)	P (t/ha)	adj. R <sup>2</sup>	RMSE	n
OSR	1996	1.60 (0.342)	1.80 (0.004)	-3.00 (<0.001)	300	4.30	0.49	0.61	64
	1997	2.60 (0.641)	1.76 (0.012)	-5.00 (<0.001)	176	4.16	0.10	0.84	63
	1998	2.39 (0.381)	1.99 (0.005)	-3.00 (<0.001)	331	5.69	0.56	0.70	64
	1999	1.11 (0.309)	2.02 (0.004)	-3.00 (<0.001)	336	4.51	0.64	0.46	63
	2002	1.25 (0.390)	3.38 (0.006)	-8.00 (<0.001)	211	4.83	0.61	0.58	64
Winter wheat	1996	6.71 (0.549)	3.50 (0.014)	-12.40 (<0.001)	140	9.17	0.38	0.64	32
	1997	4.94 (1.032)	3.99 (0.017)	-9.50 (<0.001)	210	9.13	0.30	1.34	32
	1998	4.29 (0.815)	5.99 (0.023)	-24.70 (<0.001)	121	7.92	0.38	0.90	32
	1999	2.65 (1.336)	7.98 (0.023)	-21.00 (<0.001)	189	10.23	0.58	1.17	31
	2000	3.86 (0.646)	6.55 (0.013)	-18.50 (<0.001)	176	9.66	0.71	0.83	32
	2001	3.23 (1.240)	9.63 (0.034)	-36.50 (<0.001)	131	9.58	0.52	1.40	22
	2002	2.30 (0.607)	6.34 (0.011)	-16.70 (<0.001)	189	8.31	0.76	0.80	31
Winter barley	1996	3.67 (0.675)	3.68 (0.017)	-13.20 (<0.001)	139	6.24	0.29	0.79	32
	1997	2.94 (1.155)	4.15 (0.024)	-12.60 (<0.001)	164	6.35	0.17	1.36	32
	1998	4.57 (1.055)	5.66 (0.044)	-31.60 (<0.001)	89	7.10	0.10	1.08	31
	1999	3.24 (1.155)	6.81 (0.033)	-28.10 (<0.001)	121	7.37	0.26	1.28	32
	2000	3.59 (0.601)	4.09 (0.010)	-9.50 (<0.001)	215	8.00	0.60	0.84	32
	2001	5.35 (0.852)	6.96 (0.023)	-26.30 (<0.001)	132	9.96	0.49	0.97	32
	2002	2.34 (0.632)	4.98 (0.010)	-10.20 (<0.001)	243	8.41	0.71	0.93	32

balances of OSR indicate large nitrogen residuals after harvest.

Ex ante N<sub>opt</sub>

In order to give *ex ante* recommendations which take variability of growing conditions among years into account, an identical fertilization rate over the years was calculated for each crop at which the sum of the net revenues over the years was maximal. *Ex ante* N<sub>opt</sub> values were 189 kg N/ha (LRP), 239 kg N/ha (QRP) and 222 kg N/ha (Q) in OSR, 151 kg N/ha (LRP), 162 kg N/ha (QRP) and 184 kg N/ha (Q) in wheat and 138 kg N/ha (LRP), 132 kg N/ha (QRP)

and 145 kg N/ha (Q) in barley. On an average, *ex ante* N<sub>opt</sub> was higher about 25 kg N/ha for the LRP model and 7 kg N/ha for the QRP model, but 8 kg N/ha lower for the Q model compared to the mean of the N<sub>opt</sub> values obtained *ex post*. At least on an average over the three different models, the corresponding grain yields and also net revenue values, however, were lower and N balance values were higher compared with the scenario of a variable, *ex post* calculated N<sub>opt</sub> for each year (Tables 4 and 5). Table 5 shows the influence of *ex ante* N<sub>opt</sub> on N balances and net revenues in the rotation. Compared to the LRP and Q model mean net revenues in the rotation were 10 €/ha lower calculating

Table 3. Intercept (a), linear coefficient (b), quadratic coefficient (c), adj. R<sup>2</sup>, RMSE and n of the quadratic model (S.E. ±)

Crop	Year	a	b × 10 <sup>-2</sup>	c × 10 <sup>-5</sup>	adj. R <sup>2</sup>	RMSE	n
OSR	1996	1.60 (0.334)	1.79 (0.004)	-2.88 (<0.001)	0.50	0.61	64
	1997	2.36 (0.425)	2.20 (0.005)	-6.29 (<0.001)	0.21	0.78	63
	1998	2.39 (0.381)	1.99 (0.005)	-2.67 (<0.001)	0.56	0.70	64
	1999	1.10 (0.296)	2.03 (0.004)	-3.38 (<0.001)	0.64	0.46	63
	2002	1.52 (0.321)	2.84 (0.004)	-5.85 (<0.001)	0.60	0.59	64
Winter wheat	1996	7.08 (0.446)	2.54 (0.007)	-7.20 (<0.001)	0.34	0.68	32
	1997	5.40 (0.933)	2.95 (0.013)	-5.33 (<0.001)	0.33	1.34	32
	1998	5.41 (0.663)	2.86 (0.010)	-7.45 (<0.001)	0.25	1.01	32
	1999	3.41 (1.055)	6.44 (0.015)	-14.60 (<0.001)	0.58	1.19	31
	2000	4.50 (0.571)	4.92 (0.009)	-10.90 (<0.001)	0.70	0.87	32
	2001	3.81 (1.040)	7.67 (0.018)	-23.90 (<0.001)	0.51	1.45	22
	2002	2.74 (0.546)	5.23 (0.008)	-11.60 (<0.001)	0.75	0.83	31
Winter barley	1996	3.87 (0.510)	3.08 (0.008)	-9.32 (<0.001)	0.33	0.77	32
	1997	2.84 (0.920)	4.15 (0.013)	-11.50 (<0.001)	0.24	1.32	32
	1998	5.06 (0.661)	3.33 (0.010)	-11.70 (<0.001)	0.25	1.00	31
	1999	3.67 (0.755)	5.62 (0.011)	-19.00 (<0.001)	0.43	1.15	32
	2000	3.74 (0.554)	3.73 (0.008)	-7.87 (<0.001)	0.61	0.84	32
	2001	6.00 (0.660)	5.08 (0.010)	-15.00 (<0.001)	0.47	1.00	32
	2002	2.41 (0.611)	4.82 (0.009)	-9.56 (<0.001)	0.72	0.93	32

with the QRP model (Table 7). In general, the differences between *ex post* and *ex ante* Nopt were higher for the LRP model compared to the Q model. Comparing the mean *ex post* and the *ex ante* Nopt estimated by the LRP model, it was clearly observable that the *ex ante* Nopt is the more favourable choice for fertilization recommendation because mean net revenue in the rotation increased for 14 €/ha (Table 7).

#### Monte-Carlo analysis

As an example result, the distribution of the model parameters for the LRP model in OSR is shown in Fig. 3. The C (Nopt) and b (linear coefficient) distribution curves of the year 1997 show the difficulties in

determining Nopt *ex post* in this year. Ten thousand generated parameters were too few to obtain a smooth curve because the number of generated parameters in each class was much lower compared to other years with narrower distributions. The effect of the Monte-Carlo simulation on the *ex post* LRP model parameters was an increase in Nopt (Tables 4 and 6). This effect was clearly observable, especially in OSR. Mean Nopt over the single years increased by 12 kg N/ha. In wheat, mean Nopt increased by 10 kg N/ha and in barley it only increased by 6 kg N/ha, calculated by the mean of only the years 1996, 1997, 1998, 1999 and 2002. Because of missing data on N concentration of OSR in the years 2000 and 2001, these years were omitted in the calculations for the comparison of the mean model outcomes for

Table 4. Ex post *Nopt* (kg N/ha), grain yield (t/ha), net revenue (€/ha) and N balance (kg N/ha) at ex post *Nopt* of OSR, winter wheat and winter barley

	Nopt (kg N/ha)			Grain yield (t/ha)			Net revenue (€/ha)			N balance (kg N/ha)		
	LRP	QRP	Q	LRP	QRP	Q	LRP	QRP	Q	LRP	QRP	Q
<b>OSR</b>												
1996	165	250	259	4.1	4.2	4.3	713	695	708	59	127	133
1997	137	146	151	4.1	4.1	4.3	742	735	760	34	42	43
1998	220	282	317	5.7	5.6	6.0	1009	954	1016	60	118	136
1999	188	287	256	3.9	4.4	4.1	675	715	663	94	173	153
2002	160	192	217	4.8	4.8	4.9	866	844	856	15	43	60
Mean	174	231	240	4.5	4.6	4.7	801	788	800	52	101	105
CV (%)	18.1	26.2	25.5	16.4	13.1	16.9	17.1	13.8	17.5	57.2	56.8	47.5
<b>Winter wheat</b>												
1996	106	117	135	9.2	9.1	9.2	855	840	839	-43	-36	-27
1997	136	178	220	9.0	9.0	9.3	817	796	799	-15	19	51
1998	88	109	152	7.9	7.9	8.0	737	724	712	-33	-17	15
1999	151	176	200	10.3	10.2	10.5	937	913	926	-15	-1	8
2000	131	161	198	9.6	9.6	10.0	882	865	878	-17	1	17
2001	93	124	148	9.6	9.6	9.9	899	886	903	-82	-59	-47
2002	134	172	200	8.2	8.3	8.6	743	722	736	-18	9	23
Mean	120	148	179	9.1	9.1	9.3	839	821	828	-32	-12	6
CV (%)	19.9	20.4	18.5	9.0	8.8	9.1	9.2	9.2	9.9	77.5	228.4	584.4
<b>Winter barley</b>												
1996	108	114	130	6.3	6.2	6.3	498	485	490	-1	6	16
1997	122	138	152	6.3	6.3	6.5	495	481	494	17	32	42
1998	63	79	114	7.1	7.1	7.3	602	589	592	-35	-21	4
1999	92	109	130	7.4	7.3	7.8	609	594	621	-12	1	11
2000	136	180	194	7.8	7.9	8.0	621	601	605	9	34	40
2001	102	120	147	10.0	9.9	10.2	839	821	833	-79	-65	-54
2002	138	211	217	7.9	8.3	8.4	625	620	623	6	52	55
Mean	109	136	155	7.5	7.6	7.8	613	599	608	-14	6	16
CV (%)	24.5	33.3	24.2	16.7	17.2	17.0	18.7	18.9	18.8	246.3	707.8	219.2
Mean							728	714	722	8	36	48

CV, Coefficient of variation.

the crops in the rotation for the *ex ante* approach. Also, *ex ante* analyses for the LRP model were conducted by running Monte-Carlo simulations. This again led to a considerable increase in *Nopt* of 13 kg N/ha in OSR, a small increase of 5 kg N/ha in wheat but a decrease of 2 kg N/ha in barley (Table 7). The effects of mean net revenue in the rotation were small but mean N balance rose (Table 7).

When the Monte-Carlo simulation for the Q model was carried out for the *ex post* approach only marginal changes in *Nopt* were observed for each crop, therefore annual data are not presented. The Monte-Carlo simulation for the *ex ante* *Nopt* estimated by the Q model over the years led to a slight increase of the *Nopt* values to 225 kg N/ha in OSR, 188 kg N/ha in wheat and 148 kg N/ha in barley compared to the *ex ante* *Nopt* without Monte-Carlo simulation (Table 7). It was therefore concluded that the Q model is quite stable with regard to parameter

estimation uncertainty. The Monte-Carlo simulation for the *ex ante* *Nopt* entailed only marginal effects in wheat and barley when the LRP model was used, but in OSR *Nopt* increased by about 10% from 189 to 202 kg N/ha (Table 7). Regarding N balances and net revenues, the Monte-Carlo simulation led to negligible changes. Although *Nopt* in OSR increased due to Monte-Carlo simulation there were still stronger differences between the production functions, i.e. between the LRP and the Q model in *Nopt* and N balance (Table 7). Mean yields, standard deviations of the 50 000 generated LRP and Q models and the functions of the years 1996, 1997, 1998, 1999 and 2002 are given in Figs 4 and 5 for the three crops.

*Nopt* regarding protein concentration

Protein contents of wheat could be described using Eqn (6) with a quite different accuracy for the



Table 5. Grain yield (t/ha), net revenue (€/ha) and N balance (kg N/ha) in the rotation estimated with *ex ante* Nopt

	Grain yield (t/ha)			Net revenue (€/ha)			N balance (kg N/ha)		
	LRP	QRP	Q	LRP	QRP	Q	LRP	QRP	Q
OSR									
1996	4.1	4.2	4.2	699	694	700	80	119	105
1997	4.1	4.2	4.2	710	687	697	77	118	104
1998	5.3	5.4	5.5	942	943	967	45	86	68
1999	3.9	4.2	3.9	674	701	655	95	135	125
2002	4.8	4.8	4.9	849	821	856	40	83	64
Mean	4.4	4.6	4.5	775	770	775	67	108	93
CV (%)	13.0	12.2	14.5	14.9	14.5	17.0	35.3	21.0	28.1
Winter wheat									
1996	9.2	9.2	9.3	828	820	821	-18	-11	-1
1997	9.0	8.9	9.0	808	794	792	-3	8	25
1998	7.9	7.9	8.2	701	695	704	15	24	38
1999	10.3	10.1	10.3	937	909	922	-15	-7	1
2002	8.2	8.2	8.4	734	721	734	-6	3	14
Mean	8.9	8.9	9.1	802	788	795	-5	3	16
CV (%)	10.3	9.6	9.4	11.5	10.8	10.7	262.9	419.9	104.8
Winter barley									
1996	6.2	6.2	6.4	479	482	488	24	19	27
1997	6.3	6.2	6.4	486	480	493	32	27	36
1998	7.1	7.1	7.4	556	560	582	28	22	28
1999	7.4	7.4	7.8	581	585	617	23	18	21
2002	7.9	7.1	7.4	626	562	578	6	11	17
Mean	7.0	6.8	7.1	546	534	552	23	19	26
CV (%)	10.0	8.0	9.1	11.5	9.2	10.5	43.5	30.1	27.5
Mean				707	697	707	28	44	45

different years (Table 8). Using this simple statistical model, however, the determination of Nopt considering quality payment in wheat was only possible applying the Q model. This is because the plateau yield of the other two models and the quality surplus to nitrogen price ratio led to infinitely high optimum N rates.

The calculated effects of the quality payment on the estimates for Nopt were considerable (Table 9). Mean Nopt for the wheat crop increased from 179 to 235 kg N/ha, mean net revenue from 828 to 910 €/ha and mean N balance from 6 to 42 kg N/ha. Estimating an identical Nopt considering protein concentration the N amount rose from 184 to 243 kg N/ha (Table 7). In the rotation mean N balance in the single years increased from 48 to 62 kg N/ha and mean net revenue from 722 to 749 €/ha (Table 9). These results indicate that taking grain protein concentrations into account has a tremendous influence on Nopt in wheat as well as corresponding N balance and net revenue of the whole rotation increasing the economic productivity of the wheat crop by 82 €/ha.

## DISCUSSION

The aim of the present paper was to quantify uncertainties in estimating Nopt and agronomic, ecological and economic variables in an OSR–wheat–barley rotation.

Simple statistical nitrogen response models, as used in the present study, are quite commonly used for making *ex ante* N fertilizer recommendations. The validity of these simple response models, however, is generally limited because the complex relationship between the crop yield and the N rate in interaction with variable soil and weather conditions cannot be mimicked by those simple equations. Therefore, very often only empirical reasons are considered for the acceptance or rejection of any of these models. Colwell (1994) listed statistical values like  $R^2$  and analysis of variance for the accuracy of fertilization rates estimated by different models as criteria for model choice. The obtained differences in adj.  $R^2$  values in the present study were small between models for all crops in a year (Tables 1–3) and agree with the results of Cerrato & Blackmer (1990), Bullock &

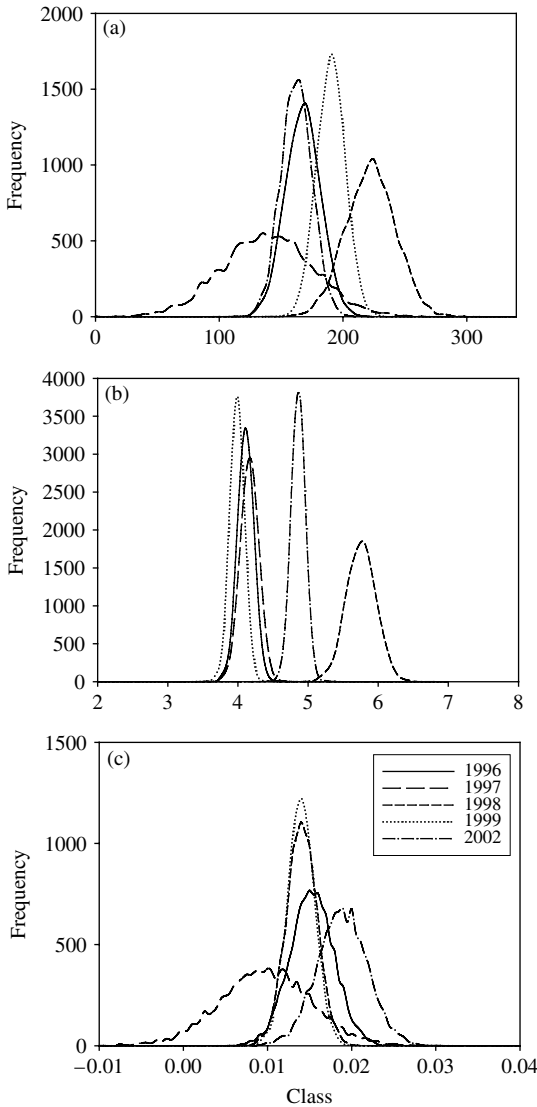


Fig. 3. Distribution of the generated parameters of the LRP model in each year for OSR (a) *C* (Nopt), (b) *P* (plateau yield), (c) *b* (linear coefficient).

Bullock (1994) and Bélanger *et al.* (2000). In addition, regression residuals have to be normally distributed for the proper application of the above mentioned empirical criteria. In the present study, this criterion was fulfilled in most of the cases. Also, the quality of dataset used for model comparison is important. The present data include many different N rates but these are remarkably scattered because of missing replications and a different splitting of total N amounts. This may have hampered to some extent a clear

distinction between the descriptive quality of the models in the study. Statistical and empirical features, however, can only be one criterion for justifying one model over the others.

The differences in the *ex post* Nopt values and the intercepts (available soil mineral N) between the years and the corresponding yields, net revenues and N balances show clearly the annual variations in nitrogen response of all investigated crops. In consequence, N balances varied greatly between the years because many factors like climate and plant stress, which cannot be influenced by the farmer, affect N use efficiency and therefore N balances. This illustrates the principal difficulties in controlling N balances.

*Ex post* Nopt values differed noticeably between the models. This agrees well with results of Cerrato & Blackmer (1990) and Bélanger *et al.* (2000). The LRP model tends to overestimate yields at Nopt (Cerrato & Blackmer 1990; Bélanger *et al.* 2000). This may be one reason that the LRP model estimated highest net revenues and lowest N balance values (Table 4).

Uncertainty in annual nitrogen response was considered by determining an *ex ante* Nopt. It was found that this kind of uncertainty led to higher N rates compared to the mean of *ex post* Nopt values. The same effect for the used price cost ratios can be expected if a multi site identical Nopt would be calculated because of different production functions due to variable soil mineral nitrogen and yield potential (Babcock 1992). The *ex ante* Nopt values of the Q model were quite similar with the official fertilization recommendations.

Uncertainties in model parameter estimates were taken into account by using Monte-Carlo simulations. This leads to both higher *ex post* and higher *ex ante* Nopt values, especially when estimated by the LRP model. The differences between the two models in Nopt therefore became smaller whereas the overall Nopt increases. The stronger effect of the Monte-Carlo simulation on the LRP model compared to the Q model is caused by the curves' progression (Figs 4 and 5). The Q model punishes very high N fertilization rates because of reducing yields when exceeding maximum yield, whereas the maximum yield estimated by the LRP model remains constant. In general, the influence of the uncertainties due to year-to-year variation and parameter estimates uncertainty on the LRP model was much higher than on the Q model thereby decreasing the differences between both models. Several studies conclude that the LRP model is more suitable to describe crop response to fertilization (Paris & Knapp 1989; Kuhlmann 1992; Baeumer 1994). Baeumer (1994) argued in an agronomic way that high Nopt, as estimated by the Q model, probably leads to high yields but does not exclude over-fertilization. In contrast, using a lower Nopt, as obtained from the LRP model, prevents

Table 6. Effect of the Monte-Carlo simulation of the LRP model parameters on *Nopt* (kg N/ha), grain yield (t/ha), net revenue (€/ha) and N balance (kg N/ha) at ex post *Nopt* in comparison to the ex ante *Nopt* estimated by the LRP model

	Nopt (kg N/ha)		Grain yield (t/ha)		Net revenue (€/ha)		N balance (kg N/ha)	
	<i>Ex post</i>	<i>Ex ante</i>	<i>Ex post</i>	<i>Ex ante</i>	<i>Ex post</i>	<i>Ex ante</i>	<i>Ex post</i>	<i>Ex ante</i>
OSR								
1996	175	202	4.1	4.1	707	691	68	91
1997	154	202	4.1	4.1	731	702	48	88
1998	234	202	5.7	5.5	1001	971	73	52
1999	196	202	3.9	3.9	670	667	101	107
2002	170	202	4.8	4.8	860	841	23	51
Mean	186		4.5	4.5	794	774	63	78
CV (%)	16.6		16.4	14.4	17.1	16.7	46.5	32.3
Winter wheat								
1996	111	156	9.2	9.2	852	825	-40	-15
1997	148	156	9.0	9.0	809	805	-5	2
1998	98	156	7.9	7.9	733	698	-26	19
1999	165	156	10.3	10.3	929	934	-8	-13
2002	143	156	8.2	8.2	738	731	-11	-2
Mean	133		8.9	8.9	812	799	-18	-2
CV (%)	20.8		10.3	10.6	10.1	11.5	81.7	777.7
Winter barley								
1996	110	136	6.3	6.3	496	481	1	22
1997	131	136	6.3	6.3	490	487	25	30
1998	65	136	7.1	7.1	600	558	-33	26
1999	103	136	7.4	7.4	603	583	-4	21
2002	148	136	7.9	7.9	620	619	13	6
Mean	111		7.0	7.0	562	546	0	21
CV (%)	28.2		10.0	10.0	11.3	11.0	5447.5	43.8

Table 7. Mean ex post *Nopt*, ex ante *Nopt* with and without Monte-Carlo simulation (MC) and corresponding net revenues and N balances

	<i>Ex post Nopt</i> (kg N/ha)			<i>Ex ante Nopt</i> (kg N/ha)			<i>Ex ante Nopt</i> (t/ha) MC	
	LRP	QRP	Q	LRP	QRP	Q	LRP	Q
OSR	174	231	240	189	239	222	202	225
Winter wheat	123	150	181	151	162	184	156	188
Winter barley	105	130	149	138	132	145	136	148
	Net revenue at <i>ex post Nopt</i> (€/ha)			Net revenue at <i>ex ante Nopt</i> (€/ha)			Net revenue at <i>ex ante Nopt</i> (€/ha) MC	
	LRP	QRP	Q	LRP	QRP	Q	LRP	Q
OSR	768	769	772	775	770	775	774	775
Winter wheat	780	789	795	802	788	795	799	795
Winter barley	533	534	551	546	534	552	546	552
	N balance at <i>ex post Nopt</i> (kg N/ha)			N balance at <i>ex ante Nopt</i> (kg N/ha)			N balance at <i>ex ante Nopt</i> (kg N/ha) MC	
	LRP	QRP	Q	LRP	QRP	Q	LRP	Q
OSR	56	101	108	67	108	93	78	96
Winter wheat	-20	-4	13	-5	3	16	-2	18
Winter barley	0	18	29	23	19	26	21	28

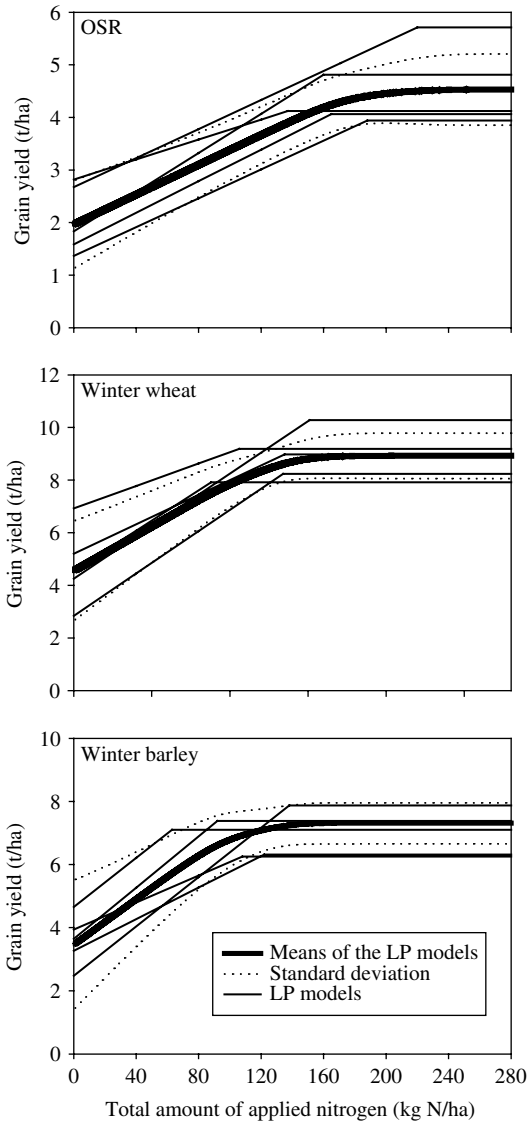


Fig. 4. LRP model fitted to five individual years (1996, 1997, 1998, 1999 and 2002) for the crops OSR, winter wheat and winter barley, as well as the mean yield response curve for the three crops derived from 50 000 simulated LRP models and the standard deviation of the mean yield.

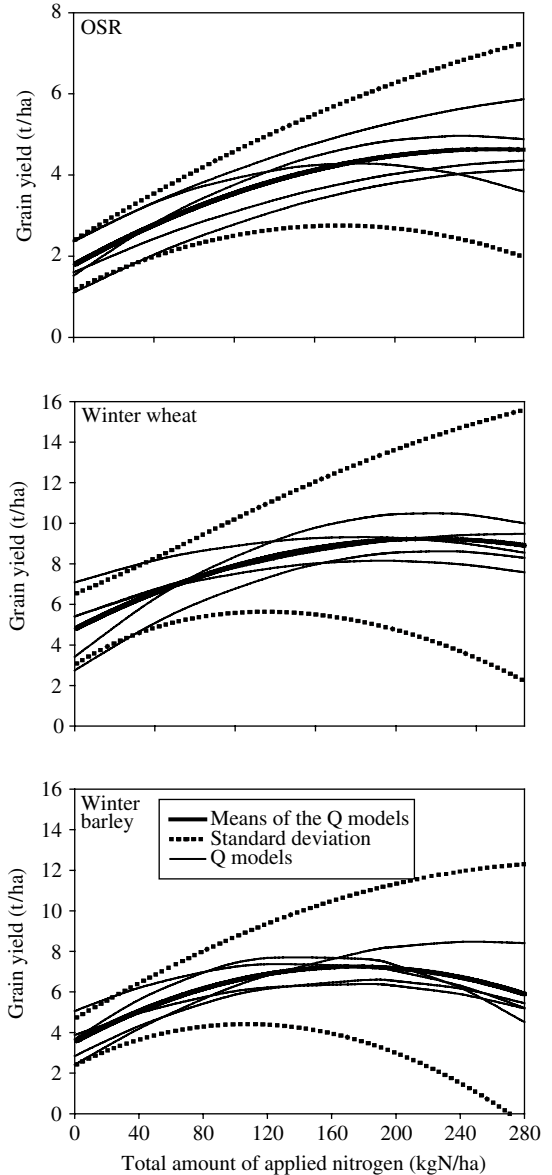


Fig. 5. Quadratic model fitted to five individual years (1996, 1997, 1998, 1999 and 2002) for the crops OSR, winter wheat and winter barley, as well as the mean yield response curve for the three crops derived from 50 000 simulated Q models and the standard deviation of the mean yield.

over-fertilization but highest yields are not assured. Baeumer (1994) favoured the application of the LRP model as a regulative strategy in order to avoid increasing negative effects of over-fertilization (e.g. N leaching, weeds). The results of the present study, however, indicate that the use of the LRP model may lead to sub-optimal yields and net revenues if fertilization recommendations are derived by simply

averaging *ex post* Nopt values estimated by this model for a range of environmental conditions. As an example, mean net revenue calculated with the mean *ex post* Nopt were 780 € for the LRP model in winter wheat compared to 802 € calculated with the *ex ante*

Table 8. Intercept (a), linear coefficients (b,c), R<sup>2</sup>, RSME and n of the protein function (S.E. ±)

Crop	Year	a	b × 10 <sup>-3</sup>	c × 10 <sup>-3</sup>	R <sup>2</sup>	RSME	n
Winter wheat	1996	2.18 (0.340)	5.63 (0.001)	-9.77 (0.004)	0.81	0.17	32
	1997	2.26 (0.363)	2.14 (0.001)	-6.60 (0.005)	0.10	0.38	32
	1998	1.95 (0.242)	3.26 (0.001)	-5.74 (0.003)	0.50	0.20	32
	1999	1.55 (0.213)	5.47 (0.001)	-4.85 (0.003)	0.64	0.22	31
	2000	1.49 (0.870)	5.07 (0.003)	-3.78 (0.013)	0.14	0.75	32
	2001	2.13 (0.176)	3.02 (0.001)	-2.89 (0.002)	0.40	0.19	22
	2002	2.05 (0.169)	4.20 (0.001)	-5.68 (0.003)	0.59	0.19	31

Nopt. Despite the fact that the LRP model may be the best model for describing yield response under homogenous boundary conditions, the heterogeneity of annual climate and different soil conditions leads to a situation where the Q model seems to be safer in terms of preventing financial losses under conditions of uncertainty. Similar conclusions were drawn by Wagner (1995a, b) by analysing yield response in different environments and over different spatial scales within agricultural fields. On the other hand, the risk of high positive N balances rises and the introduction of penalty functions may therefore reverse this ranking of models.

Due to the national implementation of the EU Nitrate Directive, German farmers face restricted N balances of 60 kg N/ha averaged over three years beginning in 2009. In the present study, this limitation could be met by *ex post* and *ex ante* analysis on a plot level but it is likely that the EC drinking water directive leads to more restrictive limits. Sieling & Kage (2006) reported that more than 34 kg N/ha leaching already exceeds the EC threshold of 50 mg/l nitrate in drinking water for a drainage rate of 300 mm typically for the experimental site. However, a stronger restriction of N balances in arable cropping systems would probably not only be associated with a reduction of N fertilization but also with other changes in production systems. Because OSR is the crop with the highest N balance surplus, the competitiveness of OSR against other crops may decrease in the situation of strongly restricted N balances. A reduction to a sub-optimal N fertilization rate, however, can also have negative effects on the efficiency of other inputs and consequently on the overall resource use efficiency in arable cropping (De Wit 1992). According to Sylvester-Bradley & Chambers (1992) and Sieling & Kage (2006) there is no direct

Table 9. Nopt (kg N/ha), grain yield (t/ha), protein concentration (mg/g), net revenue (€/ha) and N balance (kg N/ha) of winter wheat at Nopt estimated by the Q model with and without having regard to protein concentration for each year

	Nopt (kg N/ha)			Grain yield (t/ha)			Protein concentration (mg/g)			Net revenue (€/ha)			N balance (kg N/ha)			
	None protein		Protein	None protein		Protein	None protein		Protein	None protein		Protein	None protein		Protein	
	ex ante	Nopt	ex ante	Nopt	ex ante	Nopt	ex ante	Nopt	ex ante	Nopt	ex ante	Nopt	ex ante	Nopt	ex ante	Nopt
Winter wheat																
1996	135	240	243	9.0	9.0	153	118	154	839	928	928	-27	34	36		
1997	220	274	243	9.5	9.4	128	121	124	799	842	838	51	94	69		
1998	152	203	243	8.1	8.0	135	126	143	712	774	761	14	52	87		
1999	200	256	243	10.5	10.4	141	123	137	926	1015	1012	8	38	30		
2002	200	244	243	8.6	8.6	149	1.8	148	736	858	858	23	53	52		
Mean	179	235		9.3	9.1	140	126	141	828	910	879	6	42	54		
CV (%)	25.5	16.1		16.9	9.9	61	57	81	17.5	9.7	10.8	49.8	93.7	42.9		
Mean in the rotation									722	749	735	48	62	58		

short-term correlation between N balance and nitrogen leaching. Nitrogen losses due to leaching are mainly affected by weather conditions, the preceding crop and the N supply. It is also important to mention that increasing N fertilization does not automatically increase N losses via leaching if N is transformed to yield. These results underline the importance of the considerations of uncertainties for fertilization recommendations because the empirical *ex post* knowledge about Nopt is hardly to adopt when a decision about the actual N rate is made. Sylvester-Bradley & Chambers (1992) reported that fertilizer N recommendations only accommodate a small proportion of the variation in optimum N fertilizer amounts.

### CONCLUSIONS

Nitrogen response to yield and thereby net revenues and N balances varied between the single years and the estimated models in the three crops. Taking uncertain year-to-year variations and model parameter estimates into account *ex ante* Nopt tended to increase for OSR and wheat. Additionally the mean

net revenue of the whole rotation rose using the *ex ante* approach compared to the calculations with the averaged *ex post* Nopt. This effect was especially observable calculating with the LRP model but there was a smaller or even reverse effect in case of OSR when calculating with the Q model. However, simulation of parameter estimation uncertainty had a smaller effect especially on net revenues and N balances. It is therefore concluded that the effects of uncertainty depend on the yield models' functional form (LRP v. Q) The Q model seems to be quite unsusceptible to uncertainties in year-to-year nitrogen response variation and parameter estimation uncertainty but the LRP model shows an explicit increase in net revenues when uncertainties were considered. According to our calculations, restricted N balances of 60 kg N/ha surplus could be met without serious impact on profits. In practice, however, for arable farms with similar rotation and climatic conditions as underlying the present study such a restriction might be critical because of other uncertainties in N use efficiency not considered in this study.

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