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Integrating crop modelling and production economics to investigate multiple nutrient deficiencies and yield gaps*

Kerry J. Stott , Brendan Christy , Malcolm McCaskill ,
Kurt K. Benke , Penny Riffkin, Garry J. O’Leary and
Robert Norton[†]

A method is described for integrating crop modelling and production economics to quantify optimum applications of multiple nutrients and yield gaps. The method is demonstrated for crop production in the high-rainfall zone of southern Australia. Data from a biophysical crop model were used to overcome the persistent problem of inadequate experimental data. The Mitscherlich function was expanded to accommodate four variable inputs – nitrogen, phosphorus, potassium and sulphur – and the expansion path was used to determine the economic optimum application of all four nutrients. Modelling revealed the state-contingent yield potential and the extent to which unrealised yield could be explained by profit-maximising behaviour and risk-aversion by growers. If growers and their advisors were guided by the methods described, they would be better equipped to assess crop nutrient demands and limitations, predict yield potential, additional profit and the risks associated with high input systems in a variable climate. If scientists were more aware of the extra profits and the risks involved (as well as the quantitative relationships between inputs and outputs) when thinking about what to produce and how to do so, they would be more circumspect about the net benefits to be obtained from closing yield gaps.

Key words: bio-economic, four-dimensional response curve, nutrients, risk management, yield gap.

1. Introduction

Field experimentation and crop simulation studies have demonstrated capacity to increase yield potential for wheat and canola crops grown in the

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[†]Kerry Stott is a Senior Research Scientist (Economist) (email: kerry.stott@agriculture.vic.gov.au) and Kurt Benke is a Senior Research Scientist at the Centre for AgriBioscience, AgriBio, Agriculture Victoria, Bundoora, 3083, Australia. Brendan Christy is Senior Research Scientist at the Rutherglen Centre, Agriculture Victoria, Rutherglen, 3685, Australia. Malcolm McCaskill is a Soil Scientist and Penny Riffkin is a Senior Research Scientist at the Hamilton Centre, Agriculture Victoria, Hamilton, 3300, Australia. Garry O’Leary is Senior Research Scientist at the Horsham Centre, Agriculture Victoria, Horsham, 3400, Australia. Robert Norton is Associate Professor at the Faculty of Veterinary and Agricultural Sciences, The University of Melbourne, Victoria, 3010, Australia.

temperate, high-rainfall zone (HRZ) of south-eastern Australia. These areas have an annual average rainfall exceeding 500 mm and generally abundant water for producing high yielding crops (though seasons vary from favourable to water stressed during grain-filling). Recent studies suggest the long-term water-limited yield potential in the HRZ is 7–10 t/ha for wheat (*Triticum aestivum*) and 4–6 t/ha for canola (*Brassica napus*), provided cultivars best suited to the longer-cooler growing season are produced with sufficient fertilisers and other inputs required to express the superior yield potential (Riffkin and Sylvester-Bradley 2008; Acuña *et al.* 2011; Christy *et al.* 2013; Riffkin *et al.* 2016; Robertson *et al.* 2016; McCaskill *et al.* 2019). However, yields reported in agricultural statistics are much lower, averaging 2.9 t/ha for wheat and 1.5 t/ha for canola (Hochman *et al.* 2019), which for wheat is a yield gap between actual and potential of about 5 t/ha, and for canola 2 t/ha.

A meaningful interpretation of yield gaps requires giving weight to both biological and economic realities of crop production (Beddow *et al.* 2014) (Section 2.1). Biological factors limiting crop yields in the HRZ include poorly adapted germplasm (though this is being addressed by new cultivar releases), periodic waterlogging, soil acidity, disease and frost. A major limitation, and the focus of this paper, is lack of nutrition attributed to incomplete knowledge on the part of growers and their advisors about nutrient demands in crops with high yield potential, the high up-front costs and the risk of nutrient usage in a variable climate (Christy *et al.* 2015a, b). Nutrient inputs in HRZ cropping are costly, amounting to approximately \$20,600 per farm or 10 per cent of all cash costs in 2018 (ABARES 2019). The payoff is uncertain and risk-increasing when assessed using a measure that reflects both the downside and upside aspects of risk (e.g. the standard deviation of income) (Roosen and Hennessy 2003; Rajsic *et al.* 2009; Gandorfer *et al.* 2011; Pannell 2017; Monjardino *et al.* 2019). Consideration of risk would decrease rather than increase a risk-averse farmer's rate of fertiliser application. Furthermore, the extent of the decrease would increase with the degree of risk-aversion. Monjardino *et al.* (2019), for instance, found that the risk premium faced by Australian wheat producers was greater for higher N treatments compared to low N treatments, and more so in the riskier lower rainfall environments compared to high-rainfall environments.

The goals of this study were to: (i) demonstrate to growers the yield potential for wheat and canola crops and economic optimum applications of nitrogen (N), phosphorus (P), potassium (K) and sulphur (S) in the variable high-rainfall environment; (ii) determine the extent to which yield gaps and foregone profits could be attributed to considerations of marginal returns (MR) and costs and risk-aversion by the decision-maker; and (iii) develop a bio-economic analysis framework that can solve this and other similar problems of multiple limiting factors when experimental data are lacking (Section 2.2).

This paper addresses the above goals and contributes to method development in two ways. First, by extending the modified Mitscherlich response function of Gourley *et al.* (2017) for response to N in dairy pastures, and as

applied by Stott *et al.* (2018), to accommodate four variable inputs: N, P, K and S (Section 2.3). This allowed yield potential and economic optimum nutrient applications to be determined for multiple limiting factors using marginal analysis of production economics (Bishop and Toussaint 1958; Jauregui and Sain 1992) (Sections 2.4).

Much has been written about nutrient response functions in cropping since Heady's (1957) seminal work, mostly with a singular focus on N (e.g. Godden and Helyar 1980). Regrettably, marginal analysis is seldom applied because of the lack of field observations with sufficient 'design points' to map out response functions that exhibit diminishing MR (Borsen and Richter 2012) for the full range of potential weather outcomes. The second contribution of this paper was to overcome these data limitations by fitting the Mitscherlich function to yields generated from a process-level crop model calibrated for HRZ cropping – the Catchment Analysis Tool (CAT) (Christy *et al.* 2013) (Section 2.5).

The framework was applied to two hypothetical case-study paddocks in the HRZ of southern Australia (defined in Section 2.6). Estimates of optimum nutrient applications and yield gaps due to biological and economic factors (Section 3) were theoretically sound, precise estimates based on profit-maximising principles, though perhaps presented with more implied precision than is required in practice given the general flatness of payoff functions in agricultural production (Pannell 2006). Lastly, some general principles concerning the economics of nutrient application are confirmed and discussed (Section 4).

2. Methods

2.1 Conceptual framework

A stylised response function exhibiting diminishing MR, and the biological and economic contributions to the yield gap when nutrients are used to produce a crop are shown in Figure 1. The agronomic maximum, or water-limited yield potential, with best technology for a crop fully supplied with nutrients (N, P, K and S) is represented by point a. Hypothetical yields with 'marginal' or 'low' soil fertility (P, K and/or S, say) are represented by points d and e. The yield gap relative to the agronomic maximum is the difference in yield between these points and point a.

Because nutrient applications that maximise expected profit (point b in Figure 1) are less than those that maximise expected yield (Pannell 2006; Beddow *et al.* 2014), a portion of this yield gap can be attributed to economic factors. Economic optimum nutrient applications vary with the decision-maker's desired return on marginal capital (Anderson 1975; Anderson *et al.* 1977; Pannell 2006). If the desired rate of return on the marginal dollar invested in fertiliser includes a substantial risk premium (or high learning costs), say in the order of '2 to 1', the profit-maximising yield decreases

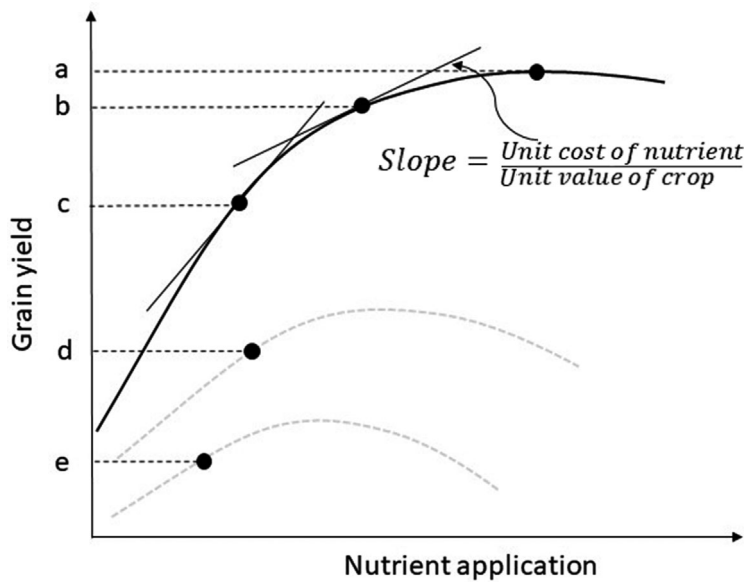


Figure 1 Hypothetical example of (a) maximum agronomic (water-limited) yield with best technology and a crop fully supplied with nutrients. (b) and (c) are yields at the maximum net value of production without and with a high-risk premium, respectively. (d) and (e) are yields achieved with, respectively, ‘marginal’ and ‘low’ soil fertility; they are on separate response functions.

further (to point c in Figure 1), possibly substantially depending on the slope of the response curve in that region.

2.2 Building blocks

The analysis (Figure 2) accommodates both wheat and canola crops grown under continuous cropping or after recent pasture conversion and is tailored to soil fertility at sowing as defined by mineral N (0–60 cm), Colwell-P (0–10 cm), Colwell-K (0–10 cm) and KCl40-S (0–10 cm).

Modelling using CAT provided time-series data spanning 60 years for estimating nutrient response curves that exhibit the diminishing MR necessary for economic analysis. CAT can replicate the high yields and N responses for wheat and canola in the HRZ (Christy *et al.* 2013, 2018). Figure 3 shows the performance of CAT with response to N fertiliser measured on 55 crops grown within the HRZ of south western Victoria. Crop application of N ranged from 12 kg N/ha at sowing up to 160 kg N/ha applied in-crop, and the supply of other nutrients was non-limiting (McCaskill *et al.* 2016). The modelled response shows no obvious prediction bias with typical root mean squared error (RMSE) of 0.57 t/ha. The CAT nitrogen model comprises four primary components: mineralisation, nitrification, volatilisation and denitrification of soil layers, and the corresponding

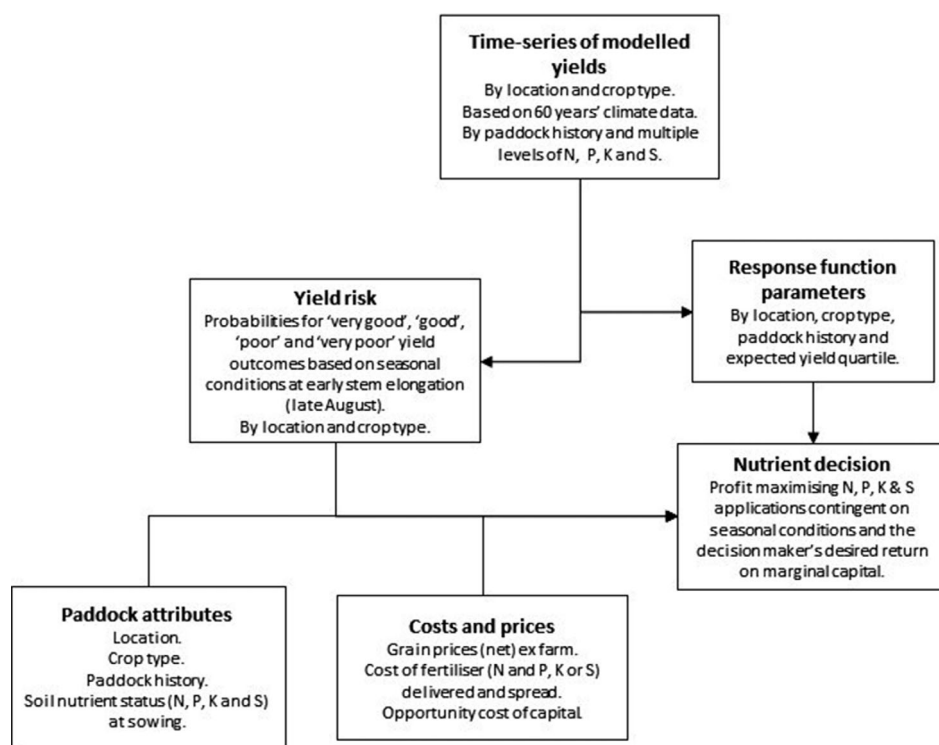


Figure 2 Building blocks for the bioeconomic analysis.

allocation between pools of nitrogen concentrations using the functions described in Neitsch *et al.* (2001, p. 340). The model monitors five different pools of nitrogen within the soil, featuring two inorganic mineral pools and three organic pools. Organic nitrogen is then further partitioned into fresh organic nitrogen associated with crop residue, and humic organic nitrogen associated with active and stable pools. Plant use of nitrogen is estimated using the supply and demand approach (Williams *et al.* 1984). Daily plant demand is a function of plant biomass and biomass N concentration. Available nitrogen in the soil (within rooting depth) is supplied to the plant. When demand exceeds supply, there is a nutrient stress. For simulating the yield response to limitations of P, K or S supply, the biomass growth responses were scaled according to empirical functions based on trials collated into a national database, 'Better Fertiliser Decisions for Cropping Systems in Australia' (Spiers *et al.* 2013).

For simplicity, no allowance was made for an experimental/modelled yield gap (i.e. the difference between the commercial yield achieved by farmers and the experimental yield achieved in controlled experiments). This could be in the order of 15 per cent (Nigussie *et al.* 2018) but has been estimated as high as 30 per cent for Victorian wheat crops (Davidson and Martin 1965).

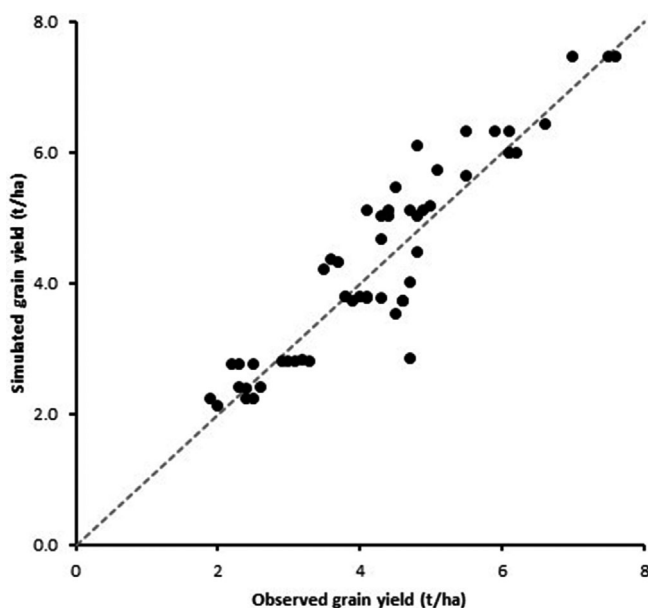


Figure 3 Yields simulated with CAT compared to observed grain yield of wheat and canola to a range of N fertiliser applied to 55 crops grown within the HRZ of south western Victoria.

Response functions were determined for four expected yield outcomes contingent on seasonal conditions. The four yield outcomes were ‘very good’, ‘good’, ‘poor’ and ‘very poor’, based on quartile years for yield. At the start of a growing season, each yield outcome is equally likely and has a probability of one-quarter. By late August, more is known about soil water levels and the climate models have better predictive performance for spring rainfall (GRDC 2005), so each outcome is no longer equally likely.

For calculating economic optimum nutrient applications, only those costs and returns that change with the nutrient treatment are considered. These include the expected farm-gate grain price and the ‘as spread’ cost of each nutrient. For simplicity, the small cost of soil testing (approximately \$5/ha) was not included in the analysis.

The precise ‘best bet’ level of nutrient to use was determined using ‘marginal analysis’ of production economics. The profit-maximising decision rule is to apply the variable input up to where the revenue from an extra kilogram of nutrient applied just exceeds its cost. With multiple nutrients, an additional rule is needed to equate marginal return from the use of all inputs simultaneously.

Optimum rates were estimated for the growers desired return on marginal capital, which could simply be the cost of additional capital for fertiliser purchases (as represented by the overdraft rate for the period under consideration) or could be higher to include a more substantial risk premium.

It was assumed that fertiliser rates are calculated to manage nutrient supply for the current crop only, neither for the following crop nor for building-up of soil reserves. Hence, the response functions were ‘conventional’ one-period nutrient response curves, not ‘maintenance curves’ that account for changes in fertiliser stocks in the soil as proposed by Godden and Helyar (1980).

2.3 The response function

There are many functional forms to choose from in production analysis (Griffin *et al.* 1987) and numerous statistical criteria (such as goodness-of-fit and general conformity to data) to aid selection. In this analysis, the Mitscherlich equation was chosen for its intrinsic properties: concavity and asymptotic convergence towards a maximum yield; and for its similarity to functions typically fitted to data in the national BFDC database (Dyson and Conyers 2013; Spiers *et al.* 2013). Concavity is important in the context of economic optimisation because it enables input levels that maximise profit to be computed from the partial derivatives.

The classical Mitscherlich equation is often used to describe the yield response of a crop to an increase in a main factor limiting its growth. Harmsen (2000) introduced moisture-dependency in a Mitscherlich equation for crop response to N availability under rain-fed conditions. To address multiple limiting nutrients, the constraint factors for each nutrient are multiplied together as proposed by Baule (1918). Multiplicative interaction among co-limiting nutrients has been found to be consistent with experimental evidence at constraint levels that apply in agriculture (Wallace 1990a, b; Wallace and Wallace 1993). In our study, the Mitscherlich adaptation of Gourley *et al.* (2017) was generalised from a conventional single-variable (N) problem to multiple limiting nutrients (N, P, K and S). The four-variable Mitscherlich equation is introduced as follows:

$$Y = \alpha \prod_i (1 - e^{(-b_i - c_i x_i)}), \quad (1)$$

where Y is the crop yield (t/ha), α is the asymptotic yield (t/ha), x_i are applied nutrients N, P, K and S (kg/ha), b_i are implicit measures of initial soil nutrient status for each nutrient i , c_i are the curvature coefficients for each nutrient i , $i = 1, 2, 3, 4$ for N, P, K and S, respectively.

2.4 Economic optimisation

2.4.1 Marginal products

The rate of change, also called the ‘marginal product’ (MP) for each input (i.e. the change in total output as one additional unit of input is added to production), is shown in Equation (2):

$$\frac{\partial y}{\partial x_i} = \alpha c_i e^{(-b_i - c_i x_i)} \prod_{i \neq j} (1 - e^{(-b_i - c_i x_i)}), \quad (2)$$

where $i, j = 1, 2, 3, 4$, respectively, for N, P, K and S.

The ‘technical rate of substitution’ between N and P, K and S, respectively, is described in Equations (3–5). In this situation, substitution should not be interpreted to mean that a wheat or canola plant is substituting nutrient P for nutrient N (for example) in a biological sense. Rather, it simply means that changes in yield are achieved by smooth changes in the proportion of nutrients (Jauregui and Sain 1992).

$$\frac{\partial n}{\partial p} = \frac{c_2 e^{(-b_2 - c_2 P)} (1 - e^{(-b_1 - c_1 N)})}{c_1 e^{(-b_1 - c_1 N)} (1 - e^{(-b_2 - c_2 P)})}, \quad (3)$$

$$\frac{\partial n}{\partial k} = \frac{c_3 e^{(-b_3 - c_3 K)} (1 - e^{(-b_1 - c_1 N)})}{c_1 e^{(-b_1 - c_1 N)} (1 - e^{(-b_3 - c_3 K)})}, \quad (4)$$

$$\frac{\partial n}{\partial s} = \frac{c_4 e^{(-b_4 - c_4 S)} (1 - e^{(-b_1 - c_1 N)})}{c_1 e^{(-b_1 - c_1 N)} (1 - e^{(-b_4 - c_4 S)})}. \quad (5)$$

2.4.2 Unit prices

The unit price of the crop (\$/kg) net of costs that vary with the volume produced (harvest costs, insurance, delivery to point of sale and any yield adjustment) is given by Equation (6):

$$p_y = (P_y - C_y)(1 - g), \quad (6)$$

where P_y is the net price of the crop at point of sale, C_y is the cost net of marketing levies, insurance, harvesting and transporting grain, and g is the experimental yield gap (set to zero for simplicity).

The bulk prices at point of sale for urea, muriate of potash, mono-ammonium phosphate and sulphate of ammonia were used to determine the unit prices of the four elements N, P, K and S. That is not to say that these elements cannot be supplied in other fertiliser blends.

The unit cost of the added N was derived as follows:

$$p_n = (P_u + t)/\text{Pct}_n, \quad (7)$$

where P_u is the price of urea fertiliser, t is the cost of delivery and spreading, and Pct_n is N content of urea (46 per cent).

The unit cost of the added K was determined similarly. The unit prices for P and S were determined from the bulk prices of the compound fertilisers after considering the value of the nitrogen (DA 2018).

Three equal split applications were assumed in determining the spreading cost for N-type fertiliser.

Unit prices and costs were sourced mostly from the Rural Solutions SA Budget Guide (RS 2018).

2.4.3 Optimum N rate

According to conventional economics for continuously variable inputs, the economic optimum N rate (N^* , kg/ha) is the point on a response function where the last increment of N returns a yield increase just large enough to pay for the additional N given background P, K and S levels (Bishop and Toussaint 1958; Malcolm *et al.* 2005). This was determined by equating Equation (2) for N to the inverse price ratio and solving for N (Equation 8).

$$N^* = \ln \left\{ \frac{\alpha c_1 e^{-b_1} (1 - e^{(-b_2 - c_2 P)}) (1 - e^{(-b_3 - c_3 K)}) (1 - e^{(-b_4 - c_4 S)}) p_y r}{p_n} \right\} / c_1. \quad (8)$$

To accommodate the decision-maker's desired return on marginal capital, p_y is multiplied by the marginal B/C ratio, denoted by r . A marginal B/C ratio of 2:1 is equivalent to a rate of return of 100 per cent where an investment is returned 12 months later but is higher for shorter intervals between expenditure and sale of the crop.

2.4.4 Profit-maximising combinations of nutrients

Least-cost combinations of N with P, K or S (the 'expansion path' in production economics) were determined from Equations (9–11), respectively:

$$P = \ln \left\{ \frac{c_2 e^{(-b_2)} (1 - e^{(-b_1 - c_1 N)}) p_n}{c_1 e^{(-b_1 - c_1 N)} (1 - e^{(-b_2 - c_2 P)}) p_p} \right\} / c_2, \quad (9)$$

$$K = \ln \left\{ \frac{c_3 e^{(-b_3)} (1 - e^{(-b_1 - c_1 N)}) p_n}{c_1 e^{(-b_1 - c_1 N)} (1 - e^{(-b_3 - c_3 K)}) p_k} \right\} / c_3, \quad (10)$$

$$S = \ln \left\{ \frac{c_4 e^{(-b_4)} (1 - e^{(-b_1 - c_1 N)}) p_n}{c_1 e^{(-b_1 - c_1 N)} (1 - e^{(-b_4 - c_4 S)}) p_s} \right\} / c_4, \quad (11)$$

where p_p is the unit price of P, p_k is the unit price of K and p_s is the unit price of S.

A partial budget was used to determine the profit-maximising combination of all four nutrients. N applications ranging from zero to 350 kg/ha were tabulated in Excel with the associated least-cost levels of P, K and S, and the predicted yield. The gross benefits were the modelled yield adjusted for any

experimental yield gap multiplied by net price of the crop. Total costs were the costs of all four nutrients, as spread. The MR and marginal costs (MC) were calculated. The profit-maximising level of nutrient use was where the MR just equal MC. This is where the B/C ratio is 1 (Equation 12), or where the rate of return on marginal capital invested in fertiliser (ROI) is zero (Equation 13).

$$B/C = \frac{MR}{MC} = \frac{\Delta(Yp_y)}{\Delta(Np_n + Pp_p + Kp_k + Sp_s)}, \quad (12)$$

$$ROI = \frac{\text{Marginal net benefits}}{MC} = \frac{MR - MC}{MC}. \quad (13)$$

Note that the B/C ratio is for the marginal dollar invested in the last unit of applied nutrient. Every unit less would add more to profit. The B/C ratio averaged over all units of added nutrient would be higher.

2.5 Calibrating the response function

The coefficients α , and c_i in Equation 1 were estimated satisfactorily for selected locations, crop types, paddock histories and yield quartiles by minimising the RMSE between predicted yields and simulated CAT yields. Parameter estimation was carried out using the Evolver option, which is an evolutionary programming algorithm in the Decision Tools Suite Ver 7.5 (Palisade Corporation 2019). The b_i coefficients in Equation 1 were set prior to optimisation from the yield ratios in Equation (14):

$$b_i = -\ln\left(1 - Y_{i,0}/Y_{i,\max}\right), \quad (14)$$

where $Y_{i,0}$ is the average yield with zero added nutrient i other nutrients unlimiting and Y_{\max} is the average yield with the maximum amount of added nutrient i other nutrients unlimiting.

CAT simulated 60 years of wheat and canola yields at selected locations using historical climate data. Scenarios for the wheat and canola crops comprised two levels of initial soil mineral N and three levels each of applied N, initial soil P, K and S. The two levels of initial soil N were as follows: (i) 'low' (85 kg N/ha) for continuous cropping; and (ii) 'high' (157 kg N/ha) for recent pasture conversions. N was applied as urea in split applications totalling 0, 90 or 250 kg N/ha. The three levels of soil P were 'low' (Colwell P; 10 mg/kg soil), 'marginal' (20 mg/kg) and 'sufficient' (30 mg/kg). Initial K soil levels were set at 'low' (Colwell K; 60 mg/kg soil), 'marginal' (200 mg/kg) and 'sufficient' (400 mg/kg). Initial S soil levels were set at 'low' (KCl-40; 3 mg/kg soil), 'marginal' (9 mg/kg) and 'sufficient' (12 mg/kg). Initial soil P, K and S values were converted into kilograms per hectare using soil factors

reported by Gourley (2013) for a PBI range of 101–300. The CAT simulations were subsetting by location, crop type, paddock history and yield quartile for analysis with Evolver.

The response functions derived from the CAT data using Evolver exhibit diminishing MR, asymptote towards a maximum yield (α), and intercept the Y-axis at a non-zero yield (b_i) (Figure 4). At the lowest level of initial soil fertility, there were pronounced responses in wheat to N, P and K, but not S (Figure 4b); however, canola had a much stronger response to added S (not shown).

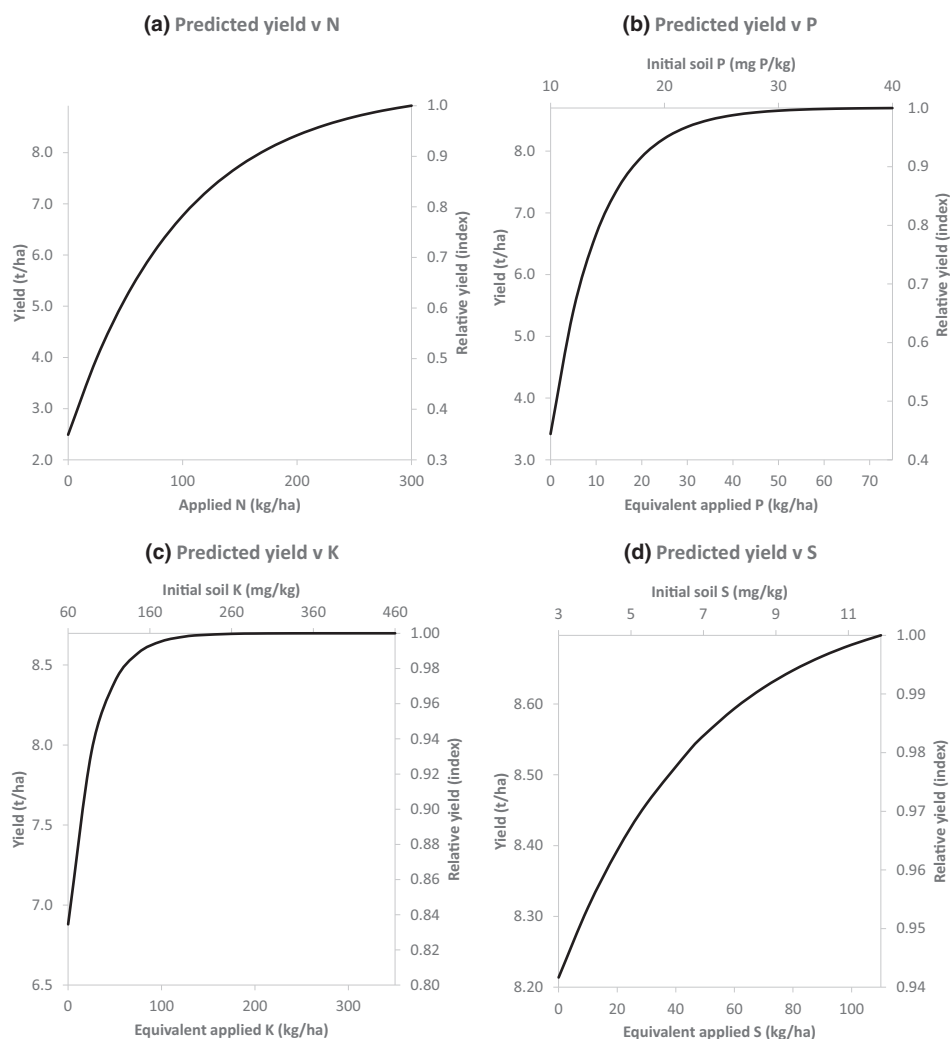


Figure 4 Predicted yield response to the applications of (a) N, (b) P, (c) K and (d) S in a wheat crop under continuous cropping at Bool Lagoon in a ‘very good’ year.

2.6 Application to crop production at Skipton and Bool Lagoon

Yield responses for wheat and canola and economic optimum nutrient applications were examined for two illustrative case studies (paddocks) located at Skipton and Bool Lagoon, in the HRZ of Victoria and South Australia, respectively. Assumptions regarding pre-sowing soil attributes, yield expectations, unit prices and costs, and the decision-maker's desired return on marginal capital are contained in Table 1.

Soil tests and paddock histories provided the necessary information about the pre-sowing nutrient status of the paddock. The paddock history was either continuous cropping with mineral N of 85 kg N/ha or pasture conversion with mineral N of 157 kg N/ha. Both paddocks tested 'low' for

Table 1 Starting soil fertility, yield expectations and economic assumptions for hypothetical wheat crops sown at Skipton and Bool Lagoon

Variable	Skipton	Bool Lagoon
Pre-sowing soil attributes		
Mineral N (0–60 cm) (kg/ha)	157 (pasture conversion scenario)	85 (continuous cropping scenario)
Colwell-P (0–10 cm) (mg/ha)	10	10
Colwell-K (0–10 cm) (mg/ha)	80	80
KCl40-S (0–10 cm) (mg/ha)	6	6
Expected yield potential for the quartile years (range)		
'Very good' (quartile 4) (t/ha)	11.1 (10.1–13.4)	8.8 (8.0–10.3)
'Good' (quartile 3) (t/ha)	9.3 (8.3–9.9)	7.1 (6.4–7.6)
'Poor' (quartile 2) (t/ha)	7.3 (6.1–8.1)	4.9 (3.7–6.1)
'Very poor' (quartile 1) (t/ha)	5.1 (2.9–6.1)	2.4 (0.5–3.6)
Wheat price (\$/t)	220	220
Contract harvesting cost (\$/t)	20	20
Freight costs (crop) (\$/t)	20	20
Unit price (net) (\$/kg)	0.15	0.15
Urea cost {46:0:0:0} (\$/t)	480	480
Fertiliser delivery costs (\$/t)	20	20
Contract fertiliser spreading costs (\$/ha)	8.50	8.50
Unit price for N (net) \$/kg	1.20	1.20
N:wheat price ratio	8.2	8.2
Mono-ammonium phosphate cost {10:22:0:0} (\$/t)	660	660
Unit price for P (net) \$/kg	2.95	2.95
P:wheat price ratio	20.1	20.1
P:N price ratio	2.5	2.5
Muriate of Potash cost {0:0:50:0} (\$/t)	490	490
Unit price for K (net) \$/kg	1.46	1.46
K:wheat price ratio	9.9	9.9
K:N price ratio	1.2	1.2
Sulphate of ammonia cost {21:0:24:0} (\$/t)	427	427
Unit price for S(net) \$/kg	1.09	1.09
S:wheat price ratio	7.4	7.4
S:N price ratio	0.9	0.9
Desired return on marginal capital	B/C ratio of 2:1, or rate of return of 100% p.a.	

soil P, K and S, respectively, 10, 80 and 6 mg/kg. Nutrient levels are well below 90 per cent of relative yield reported in Christy et al. (2015b) and strong yield responses were expected.

At sowing, N application rates were for ‘very good’ yield outcomes in the top quartile (4), the reason being that with uncertainty around the optimum rates, the profit losses from under-fertilising (yield penalty) are generally greater than those from over-fertilising (unnecessary fertiliser expense). To reduce up-front cost and risk, N input was minimised at sowing and the balance applied in split applications throughout the growing season depending on developments. For example, should the decision to apply the final top-dress be revised in late August and an El Nino event is forecast, then yield expectations would be revised down substantially (Table 2). At Skipton, the yield potential was 11.1 t/ha in a ‘very good’ year but a more modest 7.3 t/ha in a ‘poor’ year. Potential yields were lower at Bool Lagoon in all seasons (Table 1).

The N to wheat price ratio is 8:2. That is, approximately 8 kg of wheat is necessary to buy 1 kg of N – covering all the costs that vary and providing for any yield adjustment. The P to N price ratio is 2.5. That is, to buy, deliver and spread 1 kg of P costs 2.5 times more than it does for an equivalent amount of N.

The farmer’s desired rate of return on the marginal dollar invested in fertiliser is 100 per cent on an annual basis, equivalent to a ‘2 to 1’ return. This is substantially higher than the cost of additional capital for fertiliser purchases which is in the order of 5 per cent (real) – the average rate paid on business debt in the farming sector over the last 10 years (ABARES 2018) – or the return for investing in Australian equities of 9 per cent (real) p.a. and reflects a high degree of risk-aversion on the part of the decision-maker.

3. Results

3.1 Economic optimum N applications

For both the pasture conversion scenario at Skipton and the continuous cropping scenario at Bool Lagoon, unlimited P, K and S greatly increased the

Table 2 Probable link between seasonal conditions prevailing at late August‡ and yield expectations for a wheat crop grown at Bool Lagoon

Yield expectations	Good moisture and no drought influence	Good moisture with drought influence	Low moisture and no drought influence	Low moisture with drought influence
Very poor (quartile 1)	15%	0%	50%	58%
Poor (quartile 2)	18%	63%	33%	17%
Good (quartile 3)	32%	13%	0%	25%
Very good (quartile 4)	35%	25%	17%	0%

Note: ‡Four season-condition categories were based on the occurrence or otherwise of ‘good’ soil moisture and a ‘drought influence’: ‘Good’ moisture is growing season rainfall to end August in the 4th decile or above for the selected location. ‘Drought influences’ are an El Nino event or a positive Indian Ocean Dipole.

site N responsiveness, and hence the net value of adding N and the optimum N application rate (Figure 5).

The optimum N rate at Skipton determined for a marginal B/C ratio of 2:1 with unlimited P, K and S, and seasonal conditions conducive to a ‘very good’ yield outcome was 158 kg N/ha (Figure 5a). The expected yield was 10.6 t/ha, which was on the relatively flat part of the response curve, and in the range for the maximum potential yield of 11.1 (10.1–13.4) t/ha. With limited P, K, S, the profit-maximising N rate for a B/C ratio of 2:1 fell to 24 kg N/ha for a yield of 1.7 t/ha. Optimum N rates and yields were lower at Bool Lagoon, reflecting the lower overall yield potential (Figure 5b).

Figure 6 shows how lower productivity due to poorer seasons reduced both the realised yields and economic N rate. Should the N-decision be revised in late August to reflect an expectation that yields are likely to be ‘poor’, then for a B:C ratio of 2:1 and unlimiting P, K and S, the optimum N rate at Skipton would fall by 35 per cent to 102 kg N/ha – confirming the wisdom of farmer practice to apply N in split applications to ameliorate production risk (Fertiliser Institute 2016). The expected yield falls 38 per cent to 6.6 t/ha.

3.2 Economic optimum N, P, K and S applications

The optimum N application rate also decreased when the cost of adding P, K and S to a paddock deficient in these nutrients was considered. Least-cost combinations of added N, P, K and S for wheat grown at Skipton on soil with limiting fertility are shown in Figure 7. The profit-maximising N rate for a marginal B/C ratio of 2:1 declined to 130 kg/ha from 158 kg/ha with unlimited P, K and S. The profit-maximising P, K and S rates were, respectively, 26, 24 and 0 kg/ha. The predicted yield associated with this level and combination of nutrients was 7.9 t/ha. Although no S was indicated for

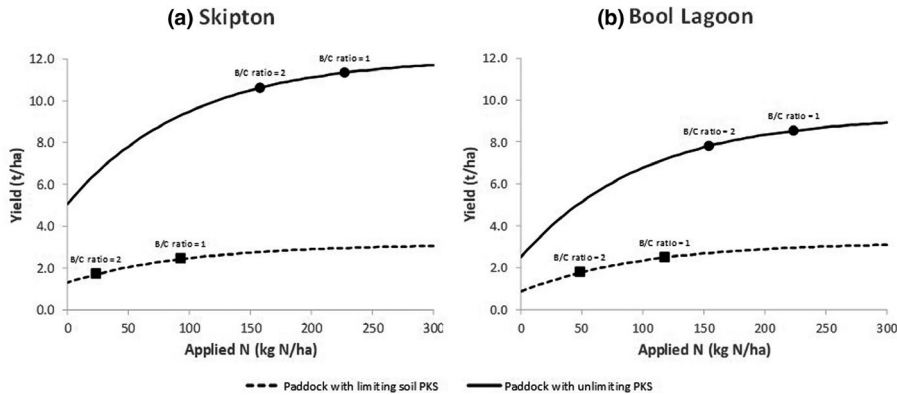


Figure 5 Yield response to in-crop applications of N and optimum N rates for marginal B/C ratios of 1 and 2 at (a) Skipton after recent pasture conversion and (b) Bool Lagoon under continuous cropping in a ‘very good’ year with limiting and unlimiting P, K and S.

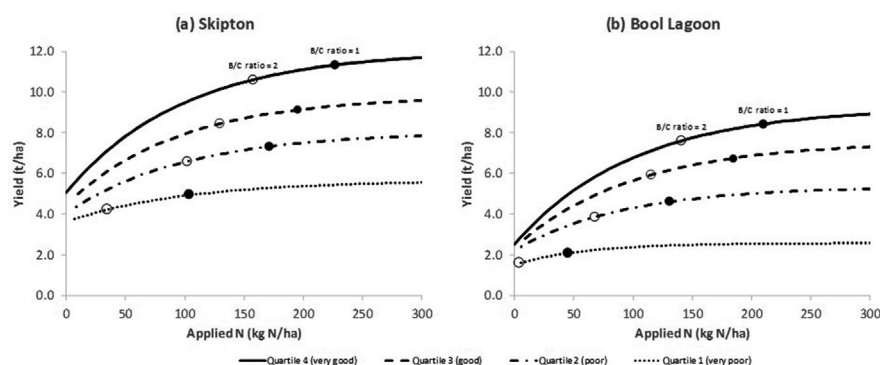


Figure 6 Wheat yield responses in ‘very good’, ‘good’, ‘poor’ and ‘very poor’ years to N applications and economic optimum N rates for marginal B/C ratios of 1 and 2 at (a) Skipton following recent pasture conversion and (b) Bool Lagoon under continuous cropping.

the wheat crop, this would not be the case for a canola crop grown at the same location (not shown).

3.3 Yield and profit gaps

Predicted yields and additional profits when nutrients were applied to wheat and canola crops grown at Skipton in a ‘good’ (quartile 3) year are presented in Tables 3–5. Yield and profit outcomes are shown for both ‘low’ and ‘high’ crop prices, with the low prices being those used previously, and the high prices reflect those achieved in southern Australia during the recent drought. Wheat prices ranged from \$220/t to \$390/t and canola price ranged from \$480/t to \$550/t. Yield and profit gaps are expressed as percentages against a baseline.

Predicted yields (Table 3) for the various nutrient scenarios ranged from a high of 9.3 t/ha (conceptually point a in Figure 1) to a low of 1.7 t/ha for wheat in the paddock with ‘low’ initial soil fertility (point e in Figure 1) and low prices. For canola, the range was 5.4–1.4 t/ha. By not addressing soil fertility and considering grower risk-aversion, represented by the 2:1 B/C ratio, the yield gap was as much as 82 per cent for wheat and 74 per cent for canola for the paddock with low fertility. It paid to apply more nutrients under the high-price scenario; yields at the lower end were higher, and the yield gaps were smaller.

Profit maximisation, represented by the 1:1 B/C ratio (point b in Figure 1), accounted for 6 per cent of the total yield gap in wheat under the low-price scenario. High risk-aversion, represented by the 2:1 B/C ratio (point c in Figure 1), accounted for a further 10 per cent drop in yield; a similar outcome to the yield-depressing effects of growing crops in a paddock with ‘marginal’ fertility (point d in Figure 1).

Additional profits and profit gaps are shown separately for paddocks starting with ‘marginal’ and ‘low’ levels of P, K, S (Tables 4, 5, respectively).

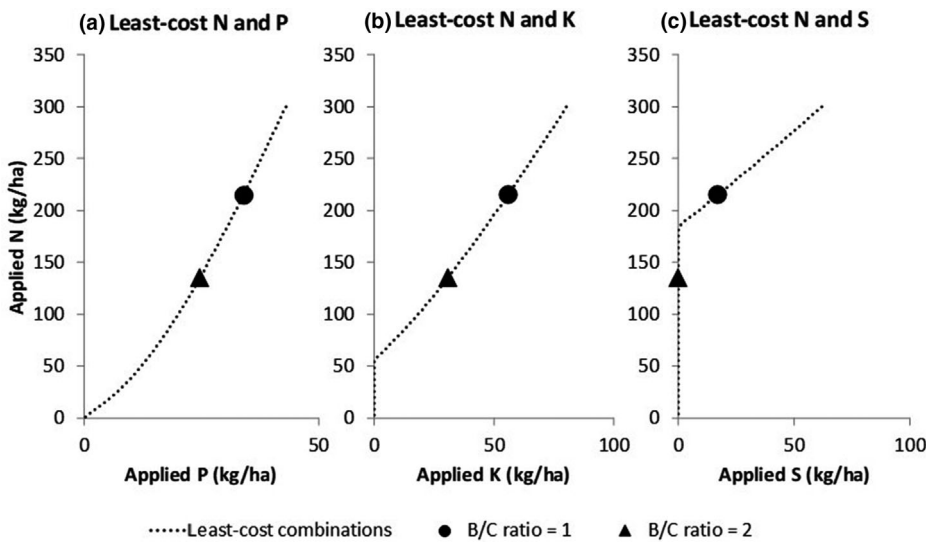


Figure 7 Least-cost nutrient combinations and optimum N, P, K and S applications for marginal B/C ratios of 1 and 2 in a ‘very good’ year for wheat at Skipton. Yields are 10.9 and 9.6 t/ha, respectively [Colour figure can be viewed at wileyonlinelibrary.com]

Table 3 Wheat and canola yields (t/ha) under various nutrient and price scenarios in a ‘good’ year (quartile 3) at Skipton. The paddock was a pasture conversion with initial mineral N of 157 kg/ha and either ‘marginal’ or ‘low’ soil P, K and S†. Percentage changes (in brackets) are relative to the maximum

Crop price‡	Wheat		Canola	
	Low	High	Low	High
Nutrient scenario				
Maximum agronomic (water-limited) yield with best technology and ‘unlimiting’ N, P, K, S	9.3 (0%)	9.3 (0%)	5.4 (0%)	5.4 (0%)
Economic optimum multiple nutrient applications (N, P, K, S) for a B/C ratio of 1:1	8.7 (–6%)	9.3 (0%)	5.1 (–6%)	5.2 (–4%)
Economic optimum multiple nutrient applications (N, P, K, S) for a B/C ratio of 2:1	7.9 (–15%)	8.6 (–8%)	4.6 (–15%)	4.7 (–13%)
Economic optimum N for a B/C ratio of 2:1 with ‘marginal’ P, K, S	7.8 (–16%)	8.4 (–10%)	4.5 (–17%)	4.6 (–15%)
Economic optimum N for a B/C ratio of 2:1 with ‘low’ P, K, S	1.7 (–82%)	2.4 (–74%)	1.4 (–74%)	1.5 (–72%)

Note: †‘Marginal’ soil P, K and S was 20, 110 and 10 mg/kg, respectively. ‘Low’ soil P, K and S was 10, 80 and 6 mg/kg, respectively. ‡The wheat price range was \$220–\$390/t. The canola price range was \$480–\$550/t.

Table 4 Additional profits (\$/ha) for wheat and canola crops grown under various nutrient and price scenarios in a ‘good’ year (quartile 3) at Skipton. The paddock was a pasture conversion with mineral N of 157 kg/ha and ‘marginal’† soil P, K and S. Percentage changes (in brackets) are relative to the maximum

Crop price‡	Wheat		Canola	
	Low	High	Low	High
Nutrient scenario				
Maximum agronomic (water-limited) yield with best technology and ‘unlimiting’ N, P, K, S	602 (–2%)	1,468 (0%)	691 (–7%)	873 (–3%)
Economic optimum multiple nutrient applications (N, P, K, S) for a B/C ratio of 1:1	614 (0%)	1,468 (0%)	742 (0%)	903 (0%)
Economic optimum multiple nutrient applications (N, P, K, S) for a B/C ratio of 2:1	590 (–4%)	1,421 (–3%)	719 (–3%)	868 (–4%)
Economic optimum N for a B/C ratio of 2:1 with ‘marginal’ P, K, S	486 (–21%)	1,241 (–15%)	562 (–24%)	698 (–23%)

Note: †‘Marginal’ soil P, K and S was 20, 110 and 10 mg/kg, respectively. ‡The wheat price range was \$220–\$390/t. The canola price range was \$480–\$550/t.

Table 5 Additional profits (\$/ha) for wheat and canola crops grown under various nutrient and price scenarios in a ‘good’ year (quartile 3) at Skipton. The paddock was a pasture conversion with mineral N of 157 kg/ha and ‘low’† soil P, K and S. Percentage changes (in brackets) are relative to the maximum

Crop price‡	Wheat		Canola	
	Low	High	Low	High
Nutrient scenario				
Maximum agronomic (water-limited) yield with best technology and ‘unlimiting’ N, P, K, S	845 (–6%)	2,174 (0%)	1,189 (–4%)	1,489 (–2%)
Economic optimum multiple nutrient applications (N, P, K, S) for a B/C ratio of 1:1	900 (0%)	2,174 (0%)	1,239 (0%)	1,518 (0%)
Economic optimum multiple nutrient applications (N, P, K, S) for a B/C ratio of 2:1	865 (–4%)	2,105 (–3%)	1,175 (–5%)	1,456 (–4%)
Economic optimum N for a B/C ratio of 2:1 with ‘low’ P, K, S	36 (–96%)	237 (–89%)	86 (–93%)	128 (–92%)

Note: †‘Low’ soil P, K and S was 10, 80 and 6 mg/kg, respectively. ‡The wheat price range was \$220–\$390/t. The canola price range was \$480–\$550/t.

For both paddocks, profits were maximised for the N, P, K and S applications that returned a B/C ratio of 1:1. Compared to this baseline, profit gaps were much smaller than yield gaps in percentage terms, provided growers addressed multiple nutrient constraints concurrently. Using high 'hurdle rate' (B/C ratio of 2:1), risk-averse growers would substantially reduce their input costs, but be only 3–5% worse off in profit terms than if they had pursued a yield maximising objective.

4. Discussion and conclusions

Our framework applied to two hypothetical case-study paddocks in the HRZ of southern Australia considered both the biological and economic realities of crop production and provided sound estimates of optimum nutrient applications and yield gaps. Novel features and strengths of this study included the use of a four-dimensional Mitscherlich equation as the basis for the economic optimisation and a crop model with proven performance in the HRZ to overcome data limitations.

The analysis reported in this paper has confirmed some general principles:

1. Site responsiveness and optimum levels of applied N were higher in better seasons. For example, should yield expectations be downgraded from 'very good' to 'poor' during the growing season, optimum yields would fall by ~30 per cent, confirming the common practice to apply N in split applications to ameliorate production risk.
2. Site responsiveness and optimum levels of applied N were also higher for higher levels of background soil fertility (i.e. initial P, K and S levels). Investing in N only at the expense of other nutrients (P, K and S) limits the optimum N rate and potential net benefits from N applications. The economic optimum N application rate decreases when the costs of adding other nutrients (P, K and S) were also considered.
3. Economic optimum nutrient applications varied with the decision-maker's desired return on marginal capital. If the desired rate of return on the marginal dollar invested in fertiliser included a substantial risk premium (say a B/C ratio on the order of 2:1), the profit-maximising amount of nutrients to apply and the realised yield would decrease, possibly substantially depending on the slope of the response curve at that point.

At the assumed unit cost of inputs and unit value of outputs used in this paper, the analysis also revealed that:

1. Profit maximisation that optimises one nutrient (N) to the exclusion of others (P, K and S) involves a substantial decline in value and profit in crop production, especially for growers with high risk-aversion (as represented by a 2:1 marginal B/C ratio). For example, in a 'good' season, the agronomic yield gap could be as high as ~10–20 per cent on soil with

- 'marginal' fertility, but a more extreme ~70–80 per cent on a soil with 'low' fertility. The respective profit gaps could be as high as ~15–25 per cent and ~90–95 per cent. These figures compare to the yield gap due to sub-optimal N fertiliser management for Australia as a whole reported by Hochman and Horan (2018) of 40 per cent. They are also consistent with Monjardino *et al.* (2019), who demonstrated for four dryland cropping sites spread across the southern wheat-belt of Australia that yield- and profit-maximising N rates are often quite similar, but can differ substantially from N rates influenced by risk and risk-aversion.
2. Multiple nutrient applications that maximise expected profit were generally less than those that maximise water-limited yield. By maximising profits (as represented by a 1:1 marginal B/C ratio) and sacrificing some yield, growers could reduce their input costs and be better-off in profit terms than by pursuing a yield maximising objective. Profit maximisation involving multiple nutrients accounted for ~5 percentage points of the total yield gap, suggesting that growers could profitably target yields of ~95 per cent of the maximum. High risk-aversion (as represented by a 2:1 marginal B/C ratio) accounted for a further ~10 percentage points of the total yield gap, suggesting a lower yield target ~85 per cent of the agronomic maximum. These ~85–95 per cent 'rule-of-thumb' yield targets are higher than the 'exploitable' yield gap of ~80 per cent from the work conducted by Lobell *et al.* (2009); the relatively benign impact on profits is consistent with the axiom of flat payoff functions in agriculture (Pannell 2006).

This paper demonstrates how profit-maximising behaviour and risk-aversion by farmers contribute to unrealised potential for increased production of wheat and canola in the HRZ of southern Australia. The yield and profit gaps could be substantial if N usage is optimised without consideration of initial soil P, K and S levels, particularly for risk-averse growers. If crop growers and their advisors are guided by the methods presented in this study, they would be better equipped to assess crop nutrient demands, and predict yield potential, additional profits and the risks associated with high input systems in a variable climate.¹ If scientists were more aware of the extra profits and risks, as well as the quantitative relationships between inputs and outputs, when thinking about what to produce and how to do so, they would be more circumspect about the size of the net benefits from closing yield gaps.

References

- Acuña, T., Dean, G. and Riffkin, P. (2011). Constraints to achieving high potential yield of wheat in a temperate, high-rainfall environment in south-east Australia, *Crop and Pasture Science* 62, 125–136.

¹ The method described in this paper has been prototyped in MS Excel[®] and provided as Supporting Information (Appendices S1 and S2).

- Anderson, J. (1975). One more or less cheer for optimality, *The Journal of the Australian Institute of Agricultural Science* 41, 195–197.
- Anderson, J., Dillon, J. and Hardaker, J. (1977). *Agricultural Decision Analysis*. The Iowa State University Press, Ames, IA.
- Australian Bureau of Agricultural and Resource Economics and Sciences, ABARES (2018). *Agricultural Commodity Statistics 2017*. Available from URL: <http://www.agriculture.gov.au/abares> [accessed 5 March 2019].
- Australian Bureau of Agricultural and Resource Economics and Sciences, ABARES (2019). *AGSURF database*. Available from URL: <http://apps.agriculture.gov.au/agsurf/agsurf.asp> [accessed 15 January 2020].
- Baule, B. (1918). Zu Mitscherlich's gesetz der physiologischen beziehungen, *Landwirtschaftliche Jahrbücher* 51, 363–385 (in German).
- Beddow, J., Hurley, T., Pardey, P. and Alston, J. (2014). Food security: yield gap, in Van Alfen, N. (ed.), *Encyclopedia of agriculture and food systems*, Vol. 3. Elsevier, San Diego, CA, pp. 352–365.
- Bishop, C. and Toussaint, W. (1958). *Agricultural Economic Analysis*. John Wiley and Sons, New York.
- Borsen, B. and Richter, G. (2012). Experimental designs for estimating plateau-type production functions and economically optimal input levels, *Journal of Productivity Analysis* 38, 45–52.
- Christy, B., O'Leary, G., Riffkin, P., Acuna, T., Potter, T. and Clough, A. (2013). Long-season canola (*Brassica napus* L.) cultivars offer potential to substantially increase grain yield production in south-eastern Australia compared with current spring cultivars, *Crop and Pasture Science* 64, 901–913.
- Christy, B., Riffkin, P., Clough, A., Norton, R. and O'Leary, G. (2015a). Crop yield potential limited by nutrient status in the high rainfall zone of Southern Australia, in Acuña, T., Moeller, C., Parsons, D. and Harrison, M. (eds), *Building productive, diverse and sustainable landscapes*. Proceedings of the 17th Australian Agronomy Conference, 21–24 September 2015, Hobart, Tas.
- Christy, B., Clough, A., Riffkin, P., Norton, R., Midwood, J., O'Leary, G., Stott, K., Weeks, A. and Potter, T. (2015b). *Managing Crop Inputs in a High Yield Potential Environment – HRZ of Southern Australia*. State of Victoria, Department of Economic Development, Jobs, Transport & Resources. Available from URL: <http://anz.ipni.net/article/ANZ-3232> [accessed 5 March 2019].
- Christy, B., Tausz-Posch, S., Tausz, M., Richards, R., Rebetzke, G., Condon, A., Mclean, T., Fitzgerald, G., Bourgault, M. and O'Leary, G. (2018). Benefits of increasing transpiration efficiency in wheat under elevated CO₂ for rainfed regions, *Global Change Biology* 24, 1,965–1,977.
- Dairy Australia (DA) (2018). *Calculating Rates and Costs*. Available from URL: <http://fertsma.rt.dairyingfortomorrow.com.au> [accessed 5 March 2019].
- Davidson, B. and Martin, B. (1965). The relationship between yields on farms and experiments, *Australian Journal of Agricultural Economics* 9, 129–140.
- Dyson, C. and Conyers, M. (2013). Methodology for online biometric analysis of soil test-crop response datasets, *Crop and Pasture Science* 64, 435–441.
- Fertiliser Institute (2016). *Split Fertiliser Application Helps Optimise Nutrient Management*. Available from URL: <http://www.nutrientstewardship.com> [accessed 7 March 2019].
- Gandorfer, M., Pannell, D. and Meyer-Aurich, A. (2011). Analysing the effects of risk and uncertainty on optimal tillage and nitrogen fertilizer intensity for field crops in Germany, *Agricultural Systems* 104, 615–622.
- Godden, D. and Helyar, K. (1980). An alternative method for deriving optimal fertiliser rates, *Review of Marketing and Agricultural Economics* 48, 83–97.
- Gourley, C. (2013). *Capital Nutrient Applications*. Available from URL: <http://fertsma.rt.dairyingfortomorrow.com.au> [accessed 7 March 2019].

- Gourley, C., Hannah, M. and Chia, K. (2017). Predicting pasture yield response to nitrogenous fertiliser in Australia using a meta-analysis derived model, with field validation, *Soil Research* 55, 567–578.
- Grains Research and Development Corporation, GRDC (2005). *Cereal Growth Stages: The Link to Crop Management*. Available from URL: <https://grdc.com.au> [accessed 7 March 2019].
- Griffin, R., Montgomery, J. and Rister, M. (1987). Selecting functional forms in production function analysis, *Western Journal of Agricultural Economics* 12, 216–227.
- Harmsen, K. (2000). A modified Mitscherlich equation for rainfed crop production in semi-arid areas: 1, *Theory*. *NJAS-Wageningen Journal of Life Sciences* 48, 237–250.
- Heady, E. (1957). An econometric investigation of the technology of agricultural production functions, *Econometrica* 25, 249–268.
- Hochman, Z. and Horan, H. (2018). Causes of yield gaps and opportunities to advance the water-limited yield frontier in Australia, *Field Crop Research* 228, 20–30.
- Hochman, Z., Gobbett, D., Horan, H., Garcia, J., Lilley, J. and Kirkegaard, J. (2019). *Yield Gap Australia*. Available from URL: <http://yieldgapaustralia.com.au> [accessed 26 July 2019].
- Jauregui, M. and Sain, G. (1992). Continuous economic analysis of crop response to fertiliser in on-farm research. CIMMYT Economics Paper No. 3. Mexico, D.F. Available from URL: <http://repository.cimmyt.org> [accessed 19 January 2018].
- Lobell, D., Cassman, K. and Field, C. (2009). Crop yield gaps: their importance, magnitude and causes, *Annual Review of Environment and Resources* 34, 179–204.
- Malcolm, L., Makeham, J. and Wright, V. (2005). *The Farming Game: Agricultural Management and Marketing*. Cambridge University Press, Melbourne, Vic.
- McCaskill, M., Stott, K., Christy, B., Clough, A., Norton, R., Pearce, A., Crozier, C., Killoran, J., Henry, F., Francis, M., Vague, A., Farlow, C., Henson, C., McLean, T., Partington, D., Edwards, J., Severi, J. and Riffkin, P. (2016). *Crop Nutrient Decisions in the High Rainfall Zone*. State of Victoria, Department of Economic Development, Jobs, Transport & Resources. Available from URL: <http://anz.ipni.net> [accessed 19 January 2020].
- McCaskill, M., Riffkin, P., Pearce, A., Christy, B., Norton, R., Speirs, A., Clough, A., Midwood, J. and Partington, D. (2019). *Critical Colwell P values for wheat and canola in the high rainfall zone*. Proceedings of the 19th Agronomy Australia Conference, 25–29 August 2019, Wagga Wagga, Australia. Available from URL: <http://agronomyaustraliaproceedings.org/index.php> [accessed 26 July 2019].
- Monjardino, M., Hochman, Z. and Horan, H. (2019). Yield potential determines Australian wheat growers' capacity to close yield gaps while mitigating economic risk, *Agronomy for Sustainable Development* 39, 39–49.
- Neitsch, S., Arnold, J., Kiniry, J. and Williams, J. (2001). *Soil and Water Assessment Tool User's Manual*. Grassland Soil and Water Research Laboratory, Temple, Texas.
- Nigussie, T., Brand, J., Walela, C. and McMurray, L. (2018). *Benchmarking Pulse Yields: Yield Gap in Lentil, Faba Bean and Chickpea in Comparison to Wheat*. Research report. Agriculture Victoria, Horsham, Victoria and South Australia Research and Development Institute, Clare, South Australia.
- Palisade (2019). *@Risk Decision Tools Suite*. Available from URL: <https://www.palisade.com> [accessed 6 February 2019].
- Pannell, D. (2006). Flat earth economics: the far-reaching consequences of flat payoff functions in economic decision making, *Review of Agricultural Economics* 28, 553–566.
- Pannell, D. (2017). Economic perspectives on nitrogen in farming systems: managing trade-offs between production, risk and the environment, *Soil Research* 55, 473–478.
- Rajscic, P., Weersink, A. and Gandorfer, M. (2009). Risk and nitrogen application levels, *Canadian Journal of Agricultural Economics* 57, 223–239.

- Riffkin, P. and Sylvester-Bradley, R. (2008). *A wheat ideotype for the high rainfall zone of south-west Victoria*, Proceedings of the 14th Australian Agronomy Conference, 21–25 September 2008, Adelaide, Australia. Available from URL: <http://agronomyaustraliaproceedings.org/index.php> [accessed 26 July 2019].
- Riffkin, P., Christy, B., O’Leary, G. and Partington, D. (2016). Contribution of phase durations to canola (*Brassica napus* L.) grain yields in the High Rainfall Zone of southern Australia. *Crop and Pasture Science* 67, 359–368.
- Robertson, M., Kirkegaard, J., Peake, A., Creelman, Z., Bell, L., Lilley, J., Midwood, J., Zhang, H., Kleven, S., Duff, C., Lawes, R. and Riffkin, P. (2016). Trends in grain production and yield gaps in the high-rainfall zone of southern Australia, *Crop and Pasture Science* 67, 921–937.
- Roosen, J. and Hennessy, D. (2003). Tests for the role of risk aversion on input use, *American Journal of Agricultural Economics* 85, 30–43.
- Rural Solutions SA (RS) (2018). *Farm Gross Margin and Farm Budget Guide*. Available from URL: <https://grdc.com.au> [accessed 6 February 2019].
- Spiers, S., Reuter, D., Peverill, K. and Brennan, R. (2013). Making better fertiliser decisions for cropping systems in Australia: an overview, *Crop and Pasture Science* 64, 417–423.
- Stott, K., Malcolm, B., Gourley, C., Hannah, M. and Cox, M. (2018). The ‘Dairy Nitrogen Fertiliser Advisor’ – a method of testing farmers’ fertiliser decisions against a meta-analysis N-response function, *Australian Farm Business Management Journal* 15, paper 1.
- Wallace, A. (1990a). Crop improvement multidisciplinary approaches to different types of stresses – Law of the maximum, *Journal of Plant Nutrition* 13, 313–325.
- Wallace, A. (1990b). Interactions of water stress and aluminium stress in barley and sunflower cultivars, *Journal of Plant Nutrition* 13, 425–436.
- Wallace, A. and Wallace, G. (1993). Limiting factors, high yields and the law of the maximum, *Horticultural Reviews* 15, 409–448.
- Williams, J., Jones, C. and Dyke, P. (1984). A modelling approach to determining the relationship between erosion and soil productivity, *Transactions of the American Society of Agricultural Engineers* 27, 129–144.

Supporting Information

Additional Supporting Information may be found in the online version of this article:

Appendix S1. Benefits and costs of spending on nutrients in high rainfall cropping: awareness tool.

Appendix S2. Benefits and costs of spending on nutrients in high rainfall cropping: planning and evaluation tool.