


11<sup>th</sup> European Conference on Precision Agriculture  
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## An Uncertainty-Based Comprehensive Decision Support System for Site-Specific Crop Management

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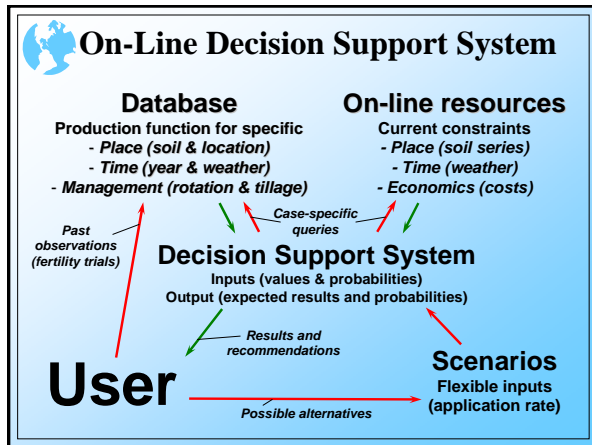

July 19, 2017



## SCAN Platform

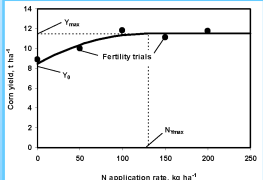


- DSS for optimal N rate calculation
- Model based on meta-analyses
- Tested and validated on farms
- Commercialized in Quebec since 2017
- However, no simulation capacity

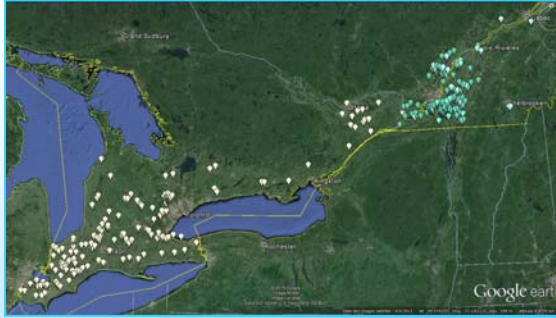


## Database

- **Production function**
  - Maximum yield
  - Minimum fertilizer rate to achieve maximum yield
  - Minimum yield or maximum yield increase due to the use of fertilizer
- **Metadata**
  - Geographic location
  - Key soil attributes
  - Landscape parameters
  - Weather summary
  - Cultivar and rotation
  - Other descriptors




## Trial Database



## On-line Resources


- **Regional geo-database**
  - Soil series
  - Soil organic matter
- **Climate assessment**
  - Summary of present conditions
  - Weather forecast
- **Economics**
  - Price of yield
  - Cost of fertilizer

with uncertainties



## Numeric Simulation

- Inputs**
  - Given **place** and **management** resulting in an estimated production function with uncertainties
  - Given **time** resulting in adjusting **production function** and derivation of the **profit function**, with uncertainties, for current conditions
- Outputs**
  - Probability of a **positive net return** over cost of fertilization for each possible rate
  - Rate of fertilization** with the greatest expected net return over cost of fertilization (e.g., profit)



Objective function:

\$/ha → MAX

## Methodology: Estimate

*Yield response:*

$$Y = \begin{cases} a_0 + a_1N + a_2N^2 & \text{for } N < N_{Y \max} \\ a_0 + a_1N_{Y \max} + a_2N_{Y \max}^2 & \text{for } N \geq N_{Y \max} \end{cases}$$

*Net Return over Cost of Fertilization:*

$$NRCF = Y \cdot c_Y - N \cdot c_N$$

*NRCF for a specific case (scenario):*

$$NRCF_i = Y(Y_{0i}, Y_{\max i}, N_{Y \max i}, N) \cdot c_{Yi} - N \cdot c_{Ni}$$

## Methodology: Probability

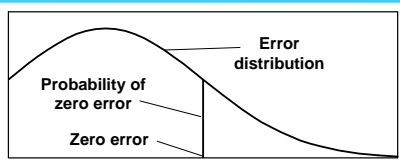
*Expected NRCF:*

$$NRCF_{est} = \sum_{i=1}^N (NRCF_i \cdot p(NRCF_i))$$

*Probability of a given NRCF scenario:*

$$p(NRCF_i) = p(Y_{0i}) \cdot p(Y_{\max i}) \cdot p(N_{Y \max i}) \cdot p(c_{Yi}) \cdot p(c_{Ni})$$

$\sum_{i=1}^N p(NRCF_i) = 1$



## Methodology: Query

- Weight of probability**
- Attribute proximity**
- Parameter imputation**

- Pilot application**
  - 1,500 database records
  - Over 60K production function scenarios
  - 15 categorized economic scenarios
- Under 5 min computation time**

## NumericAg

NumericAg is a decision support system designed to help farmers and their consultants identify the least risky site-specific rate of key agricultural inputs, such as nitrogen fertilizer. This numeric simulation process integrates previous fertility trial records, information about local conditions and economic considerations to estimate probable net return over cost of fertilization. Please enter your data below and submit the form. Certain inputs mean maximum profit.

Please sign in to NumericAg

Username

Password

Remember me

<http://www.numericag.com>

## Input Form

Navigation: Home, About, Contact | Welcome, Dashboard, Logout

**Fertilizer** Nitrogen  Date

**Location and Year** Latitude  Longitude  Year

**Soil and Climate** Slope Type  Soil Type

**Price and Cost** Fertilizer Price (USD) \$/kg: Mean  Standard Deviation

Fertilizer Cost (USD) \$/kg: Mean  Standard Deviation



## Report (E-mail)

**Viacheslav:**

Based on the information provided, please find our best estimate of the probable effect of **Nitrogen** fertilization on the expected Net Return over Cost of Fertilization (NRCF) for the conditions specified. Maximum expected NRCF is achieved with **170 kg/ha** rate of fertilization. However, please apply your risk preference when selecting the right application rate and accept our best wishes for your farming operation.

**Input parameters:**

Current crop	Climate (AWDR)	Previous crop	Season	Soil type	Tillage
Corn	50-75	Corn	2017	Clay	Conventional

**Tabulated results:**

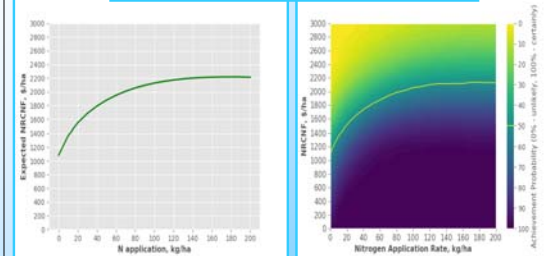
N rate kg/ha	NRCF > 1000 \$/ha	NRCF > 1500 \$/ha	NRCF > 2000 \$/ha	NRCF > 2500 \$/ha	Expected NRCF \$/ha	EFB \$/ha
0	19 %	1 %	0 %	0 %	640	0
10	33 %	6 %	1 %	0 %	870	230
:	:	:	:	:	:	:
200	81 %	43 %	22 %	11 %	1586	946



## Report 1

Current crop	Climate (AWDR)	Previous crop	Season	Soil type	Price Mean/SD	Cost Mean/SD
Corn	50-75	Corn	2017	Loam	180/55	0.62/0.15

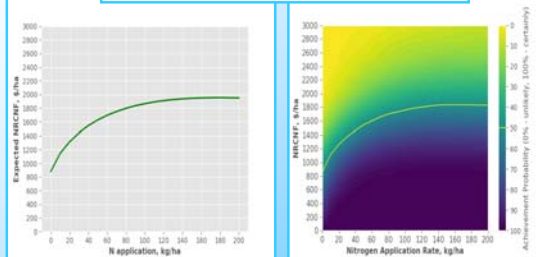
Maximum expected NRCF is achieved with **180 kg/ha**



## Report 2

Current crop	Climate (AWDR)	Previous crop	Season	Soil type	Price Mean/SD	Cost Mean/SD
Corn	25-50	Corn	2017	Loam	180/55	0.62/0.15

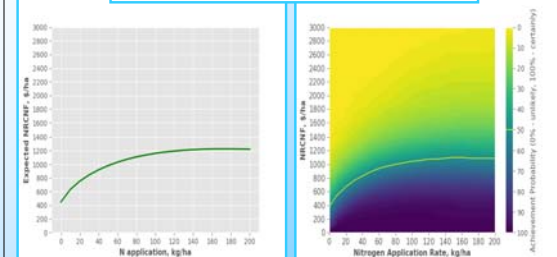
Maximum expected NRCF is achieved with **170 kg/ha**



## Report 3

Current crop	Climate (AWDR)	Previous crop	Season	Soil type	Price Mean/SD	Cost Mean/SD
Corn	50-75	Corn	2017	Sand	180/55	0.62/0.15

Maximum expected NRCF is achieved with **180 kg/ha**



## Summary

- The proposed decision support system enables
  - the determination of the optimum average application rate that maximizes expected profits (net return over cost of fertilization)
  - to define the range of such rates for a case of variable rate application
- Uncertainty-based treatment of each model input and dynamic data exchange with the underlying production function database
- Balance between expected profit losses from potential under-application and over-application errors



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