# Agent-based simulation of competing business models for a sustainable meat supply chain

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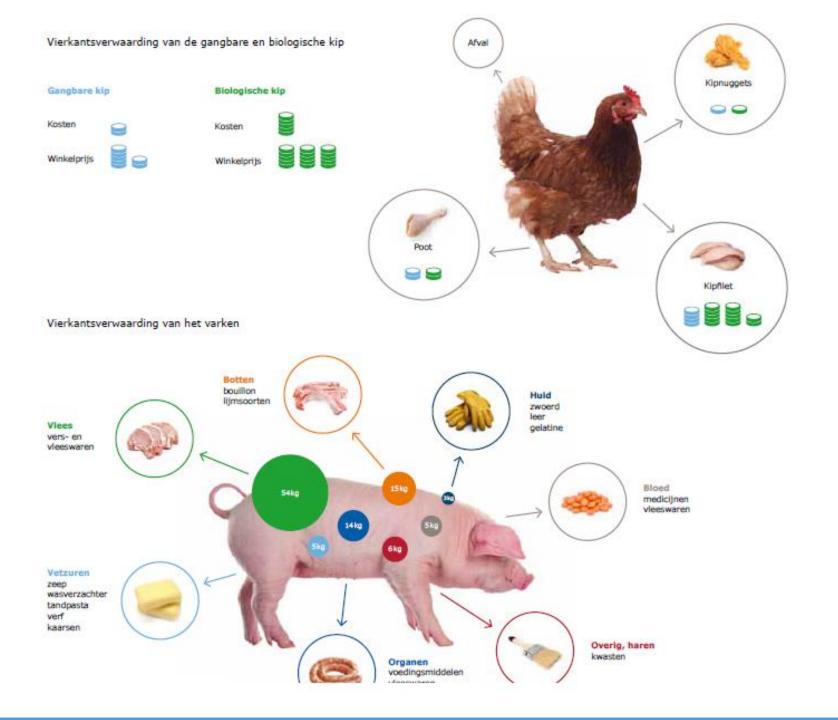
#### Introduction

#### Dutch pork supply chain



- Consumer demand for organic meat remains low
- Profits in primary sector are dwindling
  - Short term markets
  - Sustainability investments only pay off later
  - Fierce price competition (no brands)
- Therefore few investments in organic production





#### Research questions

Which business models could increase sustainable production of meat?

- Intrinsically dynamic dependencies between farmers / market / consumers
- Role of consumers and ngos

Compare plausible scenarios

- speed of sustainability uptake
- producer welfare (defaults / capital)



#### Method

- Agent based model
  - Based on stakeholder interviews/workshops in The Netherlands
  - Based on successful transitions in horticulture/ veal industry / coffee / soy markets
- Two pathways (Reinders et al., 2014):
  - increasing brand differentiation and transparency for consumers
  - cost reduction through chain internalization of external costs



### Background literature

- Interaction between consumer demand, social norms and market dynamics
  - Supply chain ABM (see Mizgier ea 2012)
  - Pork cycle and bullwhip effects (Moyaux ea 2006; Lacagnina ea 2010)
  - Opinion dynamics (Deffuant ea 2010)



#### The model - actors



 Willingness-To-Pay (premium) is determined by sustainability preference, norm sensitivity, opinion dynamics and budget



Optimize turnover given demand for sustainability; may form long term contracts



Deliver either certified or noncertified batches; invest in certification depending on demand, capital and risk aversion



NGO broadcasts sustainability information with a certain strength and tenor



### The model - actors

Agents move along a sustainability spectrum

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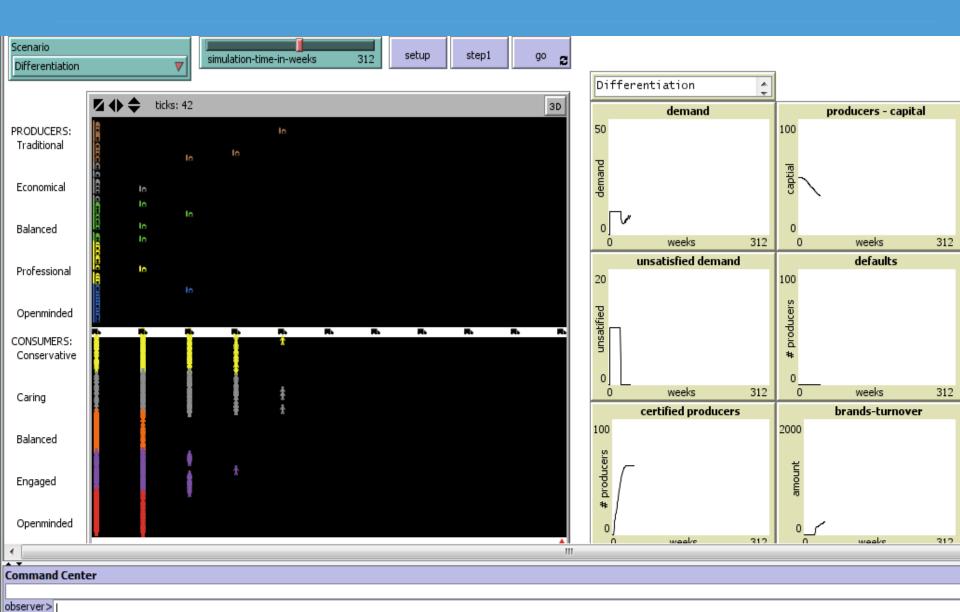








# Interface in netlogo



## The model - typology



# Consumers

- Conservative
- Caring
- Balanced
- Engaged
- Openminded
  (Hessing-Couvret ea 2002)



# Producers

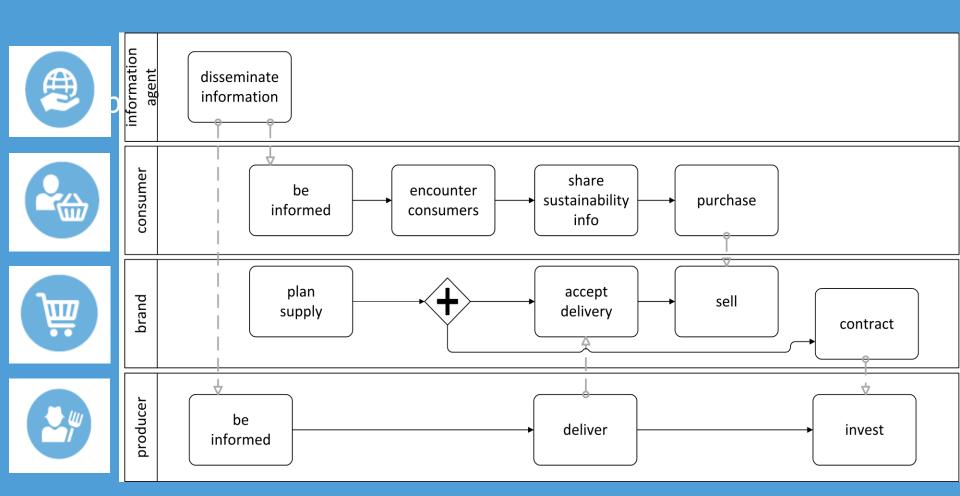
- Traditional
  - Economical
  - Balanced
  - Professional
  - Openminded(De Lauwere2002)

Differ in openness budget/capital norm sensitivity

risk aversion



# The model – time step





#### **Business models**

Baseline

Differentiation Green Track Market platform

Producers' organisation



No coordination; only regular and organic meat products



10 brands, differ in sustainability level

Example: the Netherlands)



1 brand with 10-99% of organic meat given WTP of consumers

Example: soy market



Builds on Differentiation , with supply forecasts to producers

Example: horticulture



Long term contracts between brand and producer with fixed premium.

Example: German poultry



# Results













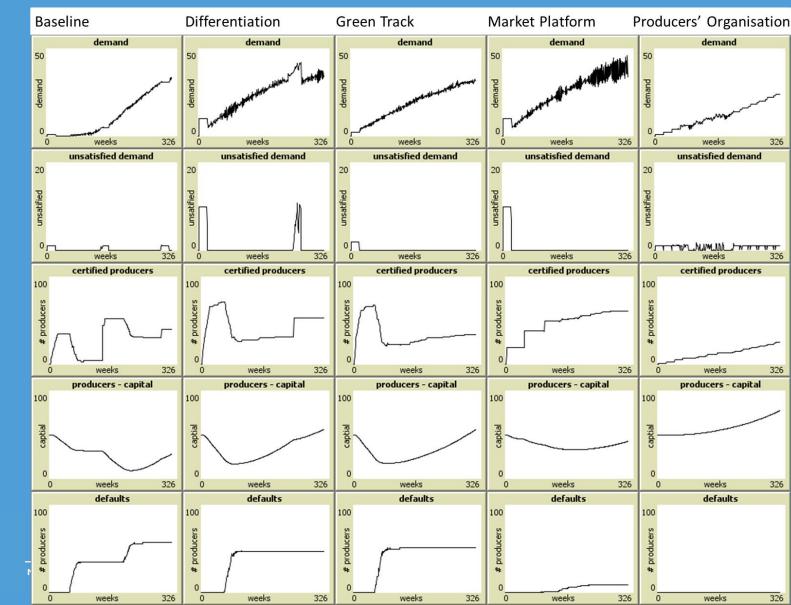
#### **Demand**

# **Unsatisfied** demand

# **Certified producers**

# Producers' capital

Producers' defaults



#### Simulation results



The Producers' Organization scenario:

- results in great wealth for the few members;
- reduces competition opportunities for the others;
- inferior sustainability compared to other scenarios

Only the Market Platform can prevent financial trouble



Product Differentiation results in

- rapid and substantial sustainability uptake
- financial trouble for many producers when not combined with the Market Platform



When applied in moderation, Green Track can further enhance both sustainability and producers' welfare



#### Conclusion

- With this model we show the potential of agent-based simulations for policy support
  - Explore scenarios for intervention in complex social or economic systems with heterogeneous actors
  - Experiment with different assumptions about the properties of the system and the agents
  - Discover unintended and unexpected effects



#### Discussion

- Simplified supply chain structure is used
  - in reality, supply chain partners (meat industry, slaughterhouses, retail) interact
- Future work: extensive sensitivity analysis
- Agent-based simulation requires detailed data
  - experts or stakeholders must make assumptions





#### Extensions

- Implement a serious game
- Participants could study effect of
  - Specific policy interventions
  - Individual decisions and strategies
  - The interplay between the above



Questions?

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# Results - Comparing scenarios











Scenario	Sustain -ability	Consumer uptake	Producer defaults	Average revenue
Baseline	3-4	Elite	Highest	Low
Differen- tiation	2	Broad	High	Moderate
Green Track	3-4	Elite	High	Moderate
Market platform	1	Broad	Low	High
Producers' organisation	5	Elite	none	Highest