

"Abatement options for GHG emissions  
in a dynamic bio-economic model for dairy farms"

- DAIRYDYN -



Wolfgang Britz & Bernd Lengers  
Institute for Food and Resource Economics, University Bonn  
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## Content

- q Background
- q Problem setting and optimization problem
- q Overview on model template DAIRYDYN and its modules
- q GHG emission indicators and abatement costs
- q Possibilities for cooperation



## Background

- q About 1/3 of agricultural GHGs in Germany directly from dairy
- q Diffuse emission sources → GHG measurements quite expensive → emission indicator needed
- q Impossible to force real life farms to abate GHGs in order to collect data on abatement strategies and related costs ...
- q Instead: simulation of cost effective abatement strategies in bio-economic model
- q Key hypothesis: abatement costs depend both on farm attributes and GHG accounting scheme

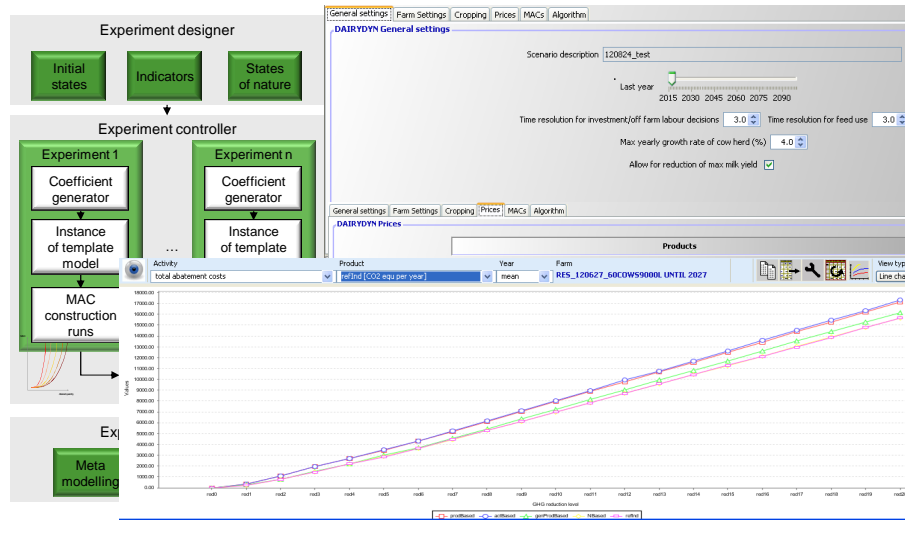


## Problem setting

- q We develop
  - A **generic model template** for German dairy farms, i.e. one which can be applied to farms with different attributes
  - A **matching coefficient generator** which populates the template with the necessary parameters
  - A **set of promising GHG emission indicators** which estimate GHGs at farm level from decision variables
- q And use that toolbox
  - To **simulate** how farmers **adjust** their **production** program when facing **GHG emission ceilings** under different indicators
  - To derive farm specific **abatement costs**
  - And select **promising indicators** and **abatement strategies**



## Overview on toolbox



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## Important characteristics to cover

- q Dairy farming is characterized by long-term investments and biological /economic linkages between different periods  
à **dynamic optimization**
- q Investment and labor decisions are not continuous  
à **mixed integer** problem
- q GHGs and thus abatement options relate to specific process attributes such as milk yield, feed mix, manure storage and application ...  
à **detailed technology description**
- q The long time future is not certain  
à **different state-of-natures (SON)** and **matching farm strategies**

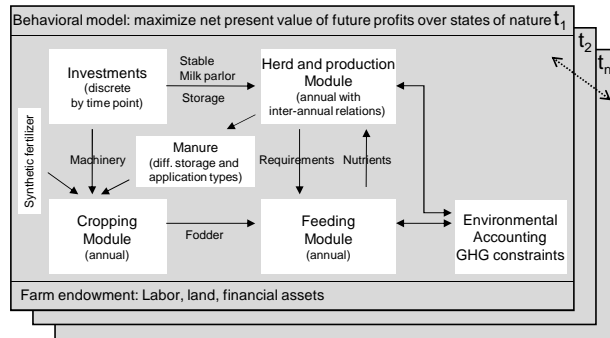
à Rather complex and large template  
(>50.000 variables, >120 binaries, depending on planning horizon and temporal resolution of investments/labor decisions)

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## Overview on model template

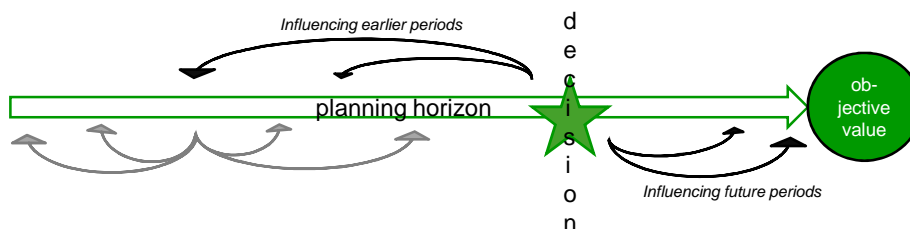


- Supply-Side-Model for single dairy farms (exogenous prices, i.e. no market feedback)
- What, how much and mix of abatement strategies are decision variables
- Bio-economic interactions between modules, including GHG savings e.g. between different gases



## Dynamic character of the model

- q Fully dynamic optimization in our context means:
- Farmers **maximizes wealth** over planning horizon
  - Implies a rational, fully informed, profit maximizing decision maker
  - Decisions in  $t$  effect optimal program in later years  $t+n$  but also earlier ones in  $t-n$
  - Recognition of path dependencies

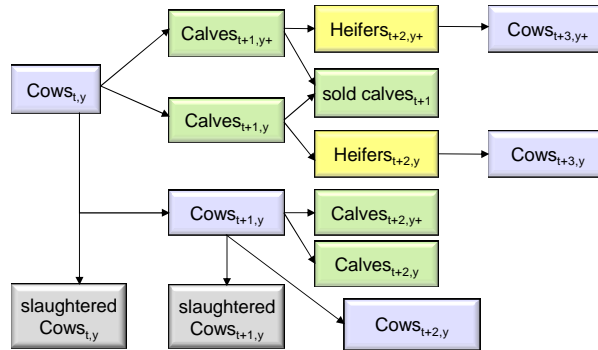




# Herd module

q Different herds:

- Dairy cows, raising calves, heifers
- All differentiated by maximal milk yield  $y \Rightarrow$  breeding strategy
- Explicit inter-annual relations



# Feeding module

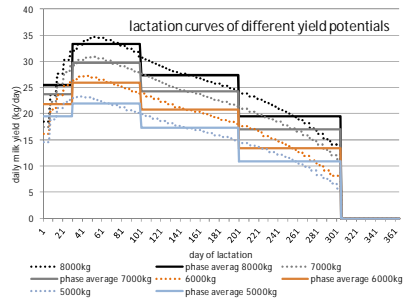
q Requirements per animal

- Energy, protein, dry matter max and min, and max/min shares of certain feed
- For cows differentiated by milk yield and lactation period

q Endogenous feed mix cover requirements

- by different self-produced fodder
- by different concentrates
- differentiated by animal type, year, intra-year planning period and SON, for cows additionally by lactation period and milk yield potential

q Milk yield potential does not need to be fully utilized





## Cropping module

- q Different types of
  - arable **cash crops** (cereals, oil seeds...)
  - And **fodder** (maize silage, grass silage, grazing of different intensities)
- q Differentiation between arable and grass lands
- q Restrictions for fertilizer application rates and maximum crop shares
- q Land can be bought/sold and rented in/out
- q Single farm payment is taken into account



## Investment & financing module

- q Investment types
  - **Stables:**
    - Different types by size and animal type (cow or young animal)
    - Depreciated over time
  - **Manure storage:**
    - Differentiated by size and coverage (none, straw, foil)
    - Depreciated over time
  - **Machinery:**
    - Tractor, plough, sprayer, manure barrel ...
    - Depreciated over operating hours
- q Financing:
  - Credits, differentiated by payback period and related interest rate
  - Own cash reserves, which alternatively draw interest
- q All investment decisions as binary variables
- q Per unit investment costs decrease with increasing size



## Labor

- q **On farm:**
  - Max. labor hours by month and by quarter year
  - Some flexibility to work more in certain months
  - Labor requirement of herds differ by stable type and milk yield
- q **Off farm:**
  - Either full or half time as integer variable
  - Or, at a lower wage rate, flexibly on a hourly basis
  - Commuting time can be explicitly taken into account



## GHG accounting and restriction

- q Five IPCC-based indicator schemes:
  1. Default per activity emission factors
  - ...
  - à stepwise increased level of detail à
  - ...
  5. Emission calculation basing on feed intake/digestibility and manure removal/application practice
- q Emissions factors attached to decision variables, value of factors and variables covered depend on indicator
- q Abatement costs are profits foregone under maximal GHG emissions, marginal abatement costs derived by stepwise enforcement of emission ceiling



## GHG abatement options

- q Flexible (monthly up to yearly):
  - Feed mix including additives (oils to increase digestibility)
  - Fertilizer application rates (organic and synthetic)
  - Frequency of manure removal
  - Pasture management
  - Milk yield per cow
  - Herd sizes
  
- q Investment based:
  - Manure storage type (with and without coverage)
  - Manure application technique (broad spread, drag hose, injector)



## Indicator dependent choice of abatement strategy

Level of detail →

	ecrBased	ProdBased	GenProdBased	Mbased	feeding
<u>investment based</u>					
manure management techniques				x	x
application techniques				x	x
<u>flexible</u>					
fodder optimization				x	x*
breeding activities		x	x	x	x
intensity management		x	x	x	x
N-reduced feeding				x	x
fertilizer practice				x	x
soil cultivation	x	x	x	x	x
herd size management, crop growing decisions	x	x	x	x	x
feed additives/ fat content					x
pasture management/ increase grazing	x	x	x	x	x

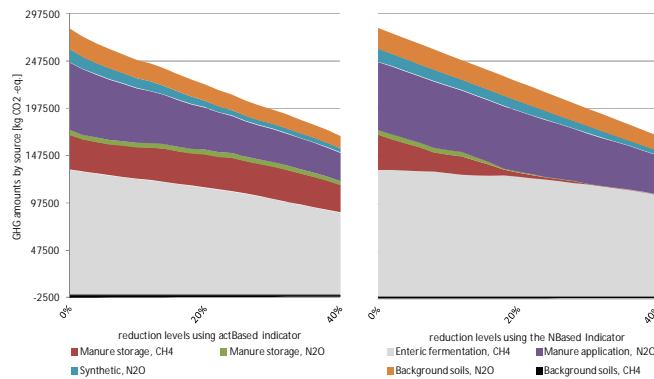
(\* also recognizing digestibility of different feed components)

à Accounted for mitigation options of the different indicators impact abatement strategy and thus MACs





## Indicator dependent abatement strategies



- Simplest indicator allows GHG reductions by adjustments of crop areas and herds only
- Detailed indicator enable GHG reduction e.g. by changes in manure management

à Indicator determines accounted mitigation strategies and adherent GHG-ACs

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## Coefficient generator

- q Allows to parameterize the model template from a few key farm characteristics (herd size and average milk yield, labor endowment, last investments in stables, stocking rate):
  - Mix of look-up tables from farm planning (labor needs, investment costs etc.) and continuous functions (e.g. requirement functions for animals)
  - Automatically chooses matching stable size and defines future investment possibilities in stables
  - ....

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## Meta-modelling (1)

- q Simulating ten reduction steps for all five indicators with a thirty year planning horizons takes about 2 hours
- q Not possible to conduct simulations for a very large number of different farms
- q Instead: development of a meta-model to identify key factors and their interaction in determining abatement costs under different indicators while reducing computing needs:
  1. Define representative sample of model farms
  2. Simulation of MAC-curves for sample
  3. Estimate regression function of MACs depending on farm attributes for each indicator
- q Long term aim: upscaling to sector



## Meta-modelling (2)

The screenshot shows the Weka Explorer GUI with the Linear Regression classifier selected. The classifier output is displayed in the main window, showing the regression equation and evaluation statistics.

```
Classifier output
SQRT_lastYear of simulation
INV_lastYear of simulation
LOG_lastYear of simulation
reduction level
SQRT_reduction level
SQRT_reduction level
INV_reduction level
LOG_reduction level
Class-numeric

Test mode: evaluate on training data

=== Classifier model (full training set) ===

Linear Regression Model

Class-numeric =
0 * SQRT_Size of starting cow herd +
-2.2790 * INV_Size of starting cow herd +
0 * SQRT_Average starting milk yield +
0.1154 * INV_Average starting milk yield +
0.2814 * reduction level +
-0.0018 * INV_reduction level +
-0.044 * LOG_reduction level +
-0.1356

Time taken to build model: 0.16 seconds

=== Evaluation on training set ===
=== Summary ===

Correlation coefficient      0.8443
Mean absolute error        0.0202
Root mean squared error    0.0256
Relative absolute error    49.9816 %
Root relative squared error 53.5894 %
Total Number of Instances  720
```

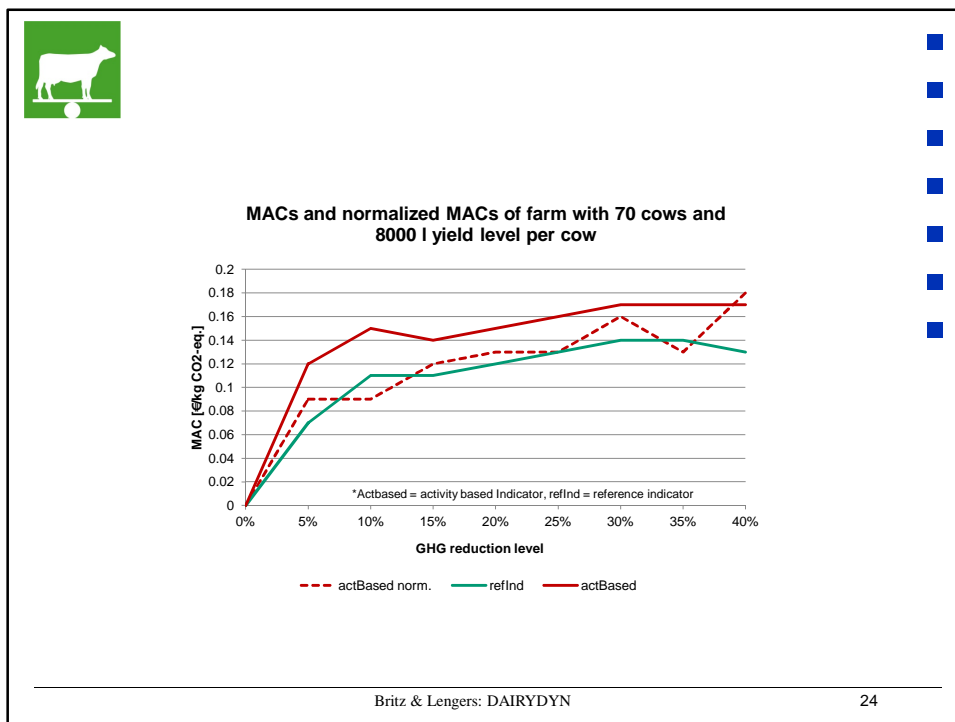
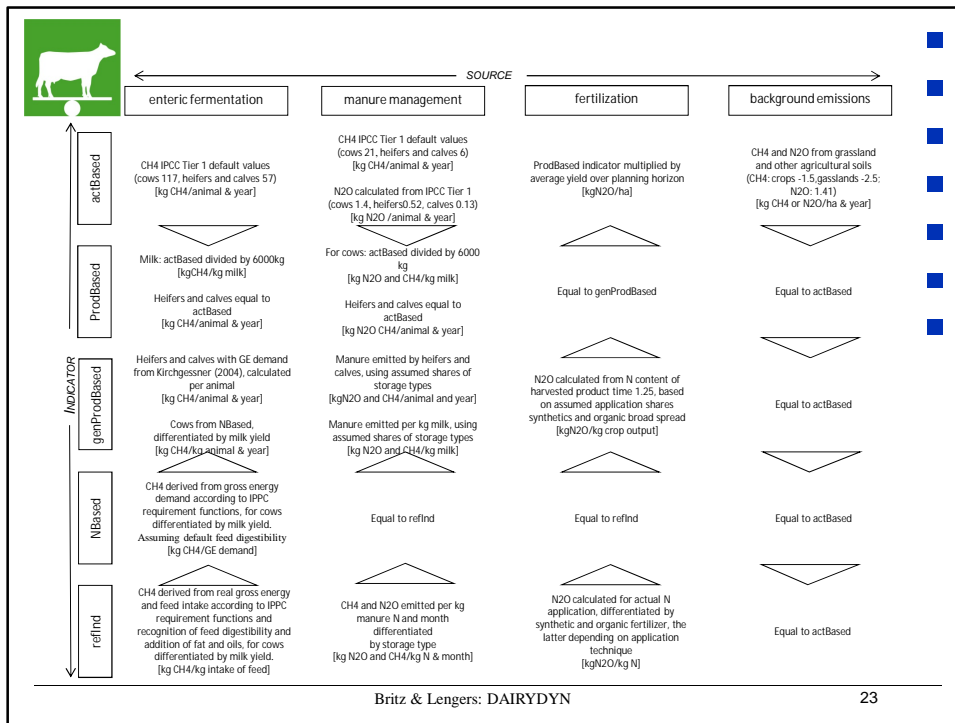


## Cooperation possible?

- q Improvement of emission factors, e.g.
  - Losses of different N-compartments in crop production
  - Requirement functions and GHG emissions (e.g. effect of feed additives) in animal production
  - Improvement of process description in crop and animal production (manure emission factors, fertilizer application rates, typical yields, budgets ...)
- q Implementation of price volatility for in- and outputs to detect uncertainty aspects of different GHG mitigation options

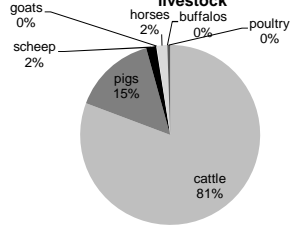


**Thank you very much for  
your intention!**

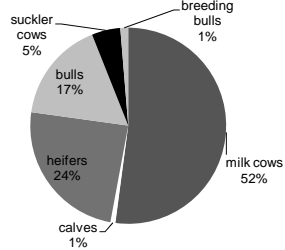




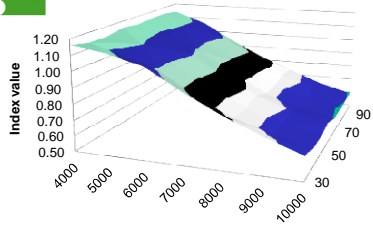
splitting of overall emissions caused by livestock



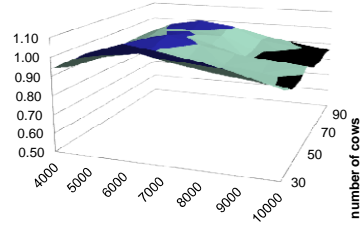
splitting of overall emission from cattle



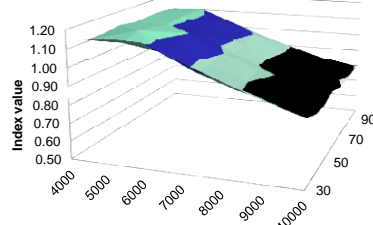
actBased



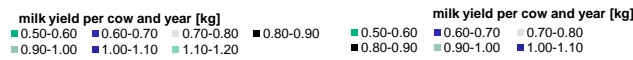
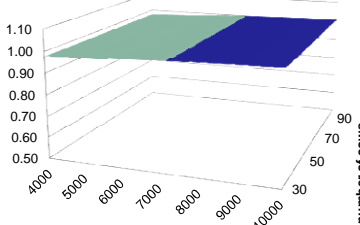
prodBased



genProdBased

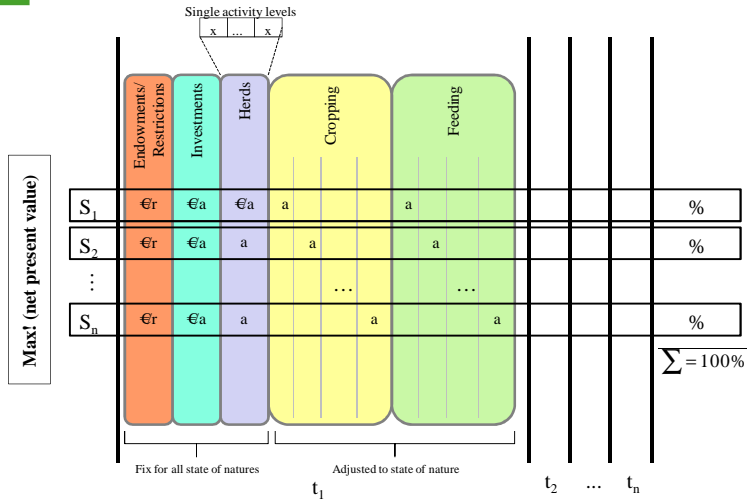


Nbased





# Systematic of the mixed integer linear programming model



$r$  = endowments at start of year (such as land, stable places, machinery park, liquidity ...)  
 $a$  = i/o, factor demand /delivery coefficient of decision variables  
 $€$  = cost/revenues related to decision variables  
 $S_n$  = States of nature