

MVE165/MMG631  
Linear and Integer Optimization with Applications  
Lecture 2  
AMPL and CPLEX, Assignment 1

Zuzana Nedělková

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# AMPL

- Algebraic modelling language for optimization problems
  - ⇒ Interface between problems and solvers
  - ⇒ Formulate optimization models and examine solutions
  - ⇒ Manage communication with an appropriate solver
- Natural syntax
- Separation of model and data
- Support for sets and set operators
- Built-in arithmetic functions
- Looping, if-then-else commands (implement “simple” algorithms)

# Solvers that work with AMPL

- **CPLEX** – linear and quadratic optimization problems in continuous and integer variables
- Gurobi – linear and quadratic optimization problems in continuous and integer variables
- CONOPT – nonlinear optimization problems in continuous variables
- MINOS – linear and nonlinear optimization problems in continuous variables
- Baron, IlogCP, Knitro, Snopt, Xpress, etc.
- See also AMPL licenses on PingPong for download

# CPLEX

- Optimization *software package* for solving linear and quadratic optimization problems in continuous and integer variables
- Originally based on the *simplex method*, implemented in C
- The *primal and dual* simplex methods (see lectures 3–4)
- The *barrier method*
- Techniques for avoiding *degeneracy* (see lecture 3)
- Generating *cutting planes* (see lecture 7)
- The *branch&bound* algorithm (see lecture 7)
- *Heuristic* methods (see lecture 8)

# The diet problem—description

- *The diet problem* (G.B. Dantzig, Interfaces 20(4):43–47, 1990) <https://resources.mpi-inf.mpg.de/departments/d1/teaching/ws14/Ideen-der-Informatik/Dantzig-Diet.pdf>
- Choose foods to meet certain nutritional requirements in the cheapest way
- A sustainable version
  - Kinds of food [*beans, egg, milk, potato, tomato*] are available in a limited amount per day and at a given price
  - 100g of each food provide given amounts of certain nutrients [*carbohydrates (CHO), protein, vitamin C, vitamin D*]
  - *Diet: requirements (upper and lower limits) on the daily amounts of each nutrient*

## The Diet Problem—data

Food	price [SEK/hg]	available [hg/day]	CHO [g/hg]	protein [g/hg]	C [mg/hg]	D [ $\mu$ g/hg]
Beans	3.3	7	3.5	1.80	16.0	0
Egg	6.0	6	0.4	12.38	0	1.47
Milk	0.9	8	4.7	3.51	0.6	1.0
Potato	2.6	10	17.5	1.81	17.4	0
Tomato	5.8	5	2.6	0.81	14.8	0
Minimum amount/day			250 g	63 g	75 mg	10 $\mu$ g
Maximum amount/day			300 g	125 g	1000 mg	1000 $\mu$ g

\* Data from [www.livsmedelsverket.se/livsmedelsdatabasen](http://www.livsmedelsverket.se/livsmedelsdatabasen) and  
[www.coop.se/Handla-online/](http://www.coop.se/Handla-online/)

# The Diet Problem—mathematical model

- Sets

- $\mathcal{J} = \{1, \dots, 5\}$  — kinds of food
- $\mathcal{I} = \{1, \dots, 4\}$  — nutrients

- Variables

- $x_j, j \in \mathcal{J}$  — purchased amount of food  $j$  per day [hg]

- Parameters

- $c_j, j \in \mathcal{J}$  — cost of food  $j$  [SEK/hg]
- $a_j, j \in \mathcal{J}$  — available amount of food  $j$  [hg]
- $p_{ij}, i \in \mathcal{I}, j \in \mathcal{J}$  — content of nutrient  $i$  in food  $j$   
[g/hg], [g/hg], [mg/hg], [ $\mu$ g/hg]
- $n_i$  — lower limit on the amount of nutrient  $i$  per day  
[g], [g], [mg], [ $\mu$ g]
- $N_i$  — upper limit on the amount of nutrient  $i$  per day  
[g], [g], [mg], [ $\mu$ g]

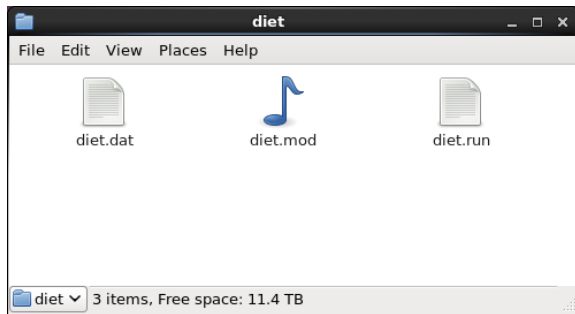
# The Diet Problem—mathematical model

$$\begin{array}{ll} \text{minimize} & \sum_{j=1}^5 c_j x_j, \\ \text{subject to} & n_i \leq \sum_{j=1}^5 p_{ij} x_j \leq N_i, \quad i = 1, \dots, 4, \\ & 0 \leq x_j \leq a_j, \quad j = 1, \dots, 5. \end{array}$$



# The Diet Problem—AMPL implementation

- Create a folder: *diet*
- Create a model file: *diet.mod*
- Create a data file: *diet.dat*
- Create a run file: *diet.run*



# The Diet Problem—AMPL implementation

- Fill the model file using text editor (Emacs, gedit, ...)
- Introduce index sets: *set*
- Comments start with *#*, each command ends with *;*
- Sets
  - $\mathcal{I} = \{1, 2, 3, 4\}$
  - $\mathcal{J} = \{1, 2, 3, 4, 5\}$

```

Model file for the diet problem

set F00D;          # index set for foods
set NUTR;         # index set for nutrients
  
```

# The Diet Problem—AMPL implementation

- Introduce variables: *var*
- Formulate non-negativity requirements
- Variables:  $x_j$ 
  - $x_j \geq 0, j \in \{1, \dots, 5\}$

The screenshot shows an Emacs window titled "emacs@math-pc23.mv.rh66.ii.2.hb.s.cdal.chalmers.se". The menu bar includes "File", "Edit", "Options", "Buffers", "Tools", and "Help". The toolbar contains icons for "Save", "Undo", "Cut", "Copy", "Paste", and "Print". The main text area contains the following AMPL code:

```
# Model file for the diet problem

set FOOD;                # index set for foods
set NUTR;                # index set for nutrients

var eat {j in FOOD} >= 0; # decision variables, amount of food [hg]
█
```

The status bar at the bottom indicates the current file is "diet.mod", line 7, column 17, in the "Modula-2" mode. A message "Minibuffer window is not active" is displayed below the status bar.

# The Diet Problem—AMPL implementation

- Introduce parameters: *param*
- Parameters
  - $c_j, j \in \{1, \dots, 5\}$
  - $a_j, j \in \{1, \dots, 5\}$
  - $p_{ij}, i \in \{1, \dots, 4\}, j \in \{1, \dots, 5\}$
  - $n_i, N_i, i \in \{1, \dots, 4\}$

The screenshot shows an Emacs editor window titled "emacs@math-pc23.mv.rh66.il.2.hb.s.cdal.chalmers.se". The window contains the following AMPL code:

```
# Model file for the diet problem

set FOOD;                # index set for foods
set NUTR;                 # index set for nutrients

var eat {j in FOOD} >= 0; # decision variables, amount of food [hg]

param cost {FOOD} > 0;    # price of foods [SEK/hg]
param eat_max {FOOD} > 0; # maximum daily amount of food [hg]
param cont {NUTR,FOOD} >= 0; # amount [g,\mu g,mg] of nutrient in 1hg of food
param n_min {NUTR} >= 0;  # minimum daily amount of nutrition [g, \mu g, mg]
param n_max {i in NUTR} >= n_min[i]; # maximum daily amount of nutrition

[]
```

The status bar at the bottom of the window displays ":-:\*\*- diet.mod All L13 (Modula-2)".

# The Diet Problem—AMPL implementation

- Formulate an objective function: *minimize, maximize*
- Use built-in arithmetic functions:

$+$ ,  $-$ ,  $*$ ,  $^$ ,  $/$ , *sum, prod, abs, log, sin, ...*

- $\min \sum_{j=1}^5 c_j x_j$

```

# Model file for the diet problem

set FOOD;                # index set for foods
set NUTR;                # index set for nutrients

var eat {j in FOOD} >= 0; # decision variables, amount of food [hg]

param cost {FOOD} > 0;   # price of foods [SEK/hg]
param eat_max {FOOD} > 0; # maximum daily amount of food [hg]
param cont {NUTR,FOOD} >= 0; # amount [g,\mu g,mg] of nutrient in 1hg of food
param n_min {NUTR} >= 0; # minimum daily amount of nutrition [g, \mu g, mg]
param n_max {i in NUTR} >= n_min[i]; # maximum daily amount of nutrition

minimize total_cost:
    sum {j in FOOD} cost[j] * eat[j];
[]
  
```

# The Diet Problem—AMPL implementation

- Formulate constraints: *subject to*
- Use arithmetic relations:  $>$  ,  $\geq$  ,  $<$  ,  $\leq$  ,  $==$  ,  $!=$  , ...
- $n_i \leq \sum_{j=1}^5 p_{ij}x_j \leq N_i, i = 1, \dots, 4,$
- $x_i \leq a_i, i = 1, \dots, 3$

```

emacs@math-pc23.mv.rh66.ll.2.hb.s.cda1.chalmers.se
File Edit Options Buffers Tools Help
Save Undo
# Model file for the diet problem

set FOOD;                # index set for foods
set NUTR;                 # index set for nutrients

var eat {j in FOOD} >= 0; # decision variables, amount of food [hg]

param cost {FOOD} > 0;    # price of foods [SEK/hg]
param eat_max {FOOD} > 0; # maximum daily amount of food [hg]
param cont {NUTR,FOOD} >= 0; # amount [g,\mu g,mg] of nutrient in 1hg of food
param n_min {NUTR} >= 0;  # minimum daily amount of nutrition [g, \mu g, mg]
param n_max {i in NUTR} >= n_min[i]; # maximum daily amount of nutrition

minimize total_cost:
  sum {j in FOOD} cost[j] * eat[j];

subject to nutr_cont {i in NUTR}:
  n_min[i] <= sum {j in FOOD} cont[i,j] * eat[j] <= n_max[i];

subject to food_max {j in FOOD}:
  eat[j] <= eat_max[j];

--*- diet.mod All 112 (Modula-2)
  
```

# The Diet Problem—AMPL implementation

- Fill in the data file using the text editor
- Assign values to the introduced sets and parameters

```

emacs@math-pc23.mv.rh66.ii.2.hb.s.cdal.chalmers.se
File Edit Options Buffers Tools Help
[Icons] Save Undo [Icons]
set NUTR := Protein Carbohydrate VitD VitC;
set FOOD := Egg Beans Tomato Milk Potato;

param: cost eat_max:= # SEK/hg hg/day
Beans 3.3 7
Egg 6.0 6
Milk 0.9 8
Potato 2.6 10
Tomato 5.8 5;

param: n_min n_max := # g/day
Carbohydrate 250 300 # g/day
Protein 63 125 # g/day
VitC 75 1000 # mg/day
VitD 10 1000 ; # \mu g/day

param cont (tr): # amount per 1hg food
Carbohydrate Protein VitC VitD :=
Beans 3.5 1.80 16.0 0
Egg 0.4 12.38 0 1.47
Milk 4.7 3.51 0.6 1.0
Potato 17.5 1.81 17.4 0
Tomato 2.6 0.81 14.8 0 ;

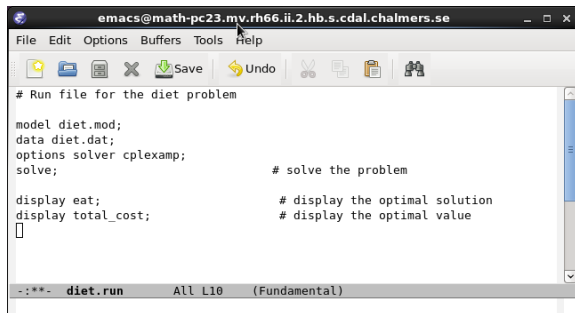
# g g mg \mu g

-:--- diet.dat All L1 (Fundamental)
For information about GNU Emacs and the GNU system, type C-h C-a.

```

# The Diet Problem—AMPL implementation

- Fill the run file using the text editor
- Load the model and the data: *model*, *data*
- Choose solver: *options solver*
- Solve the problem: *solve*
- Display results: *display*



```
emacs@math-pc23.mv.rh66.ii.2.hb.s.cdal.chalmers.se
File Edit Options Buffers Tools Help
Save Undo
# Run file for the diet problem

model diet.mod;
data diet.dat;
options solver cplexamp;
solve;                                # solve the problem

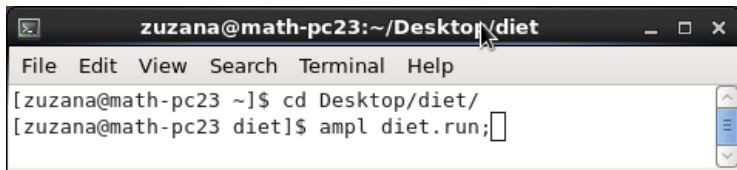
display eat;                           # display the optimal solution
display total_cost;                     # display the optimal value
[]

-:*** diet.run All L10 (Fundamental)
```



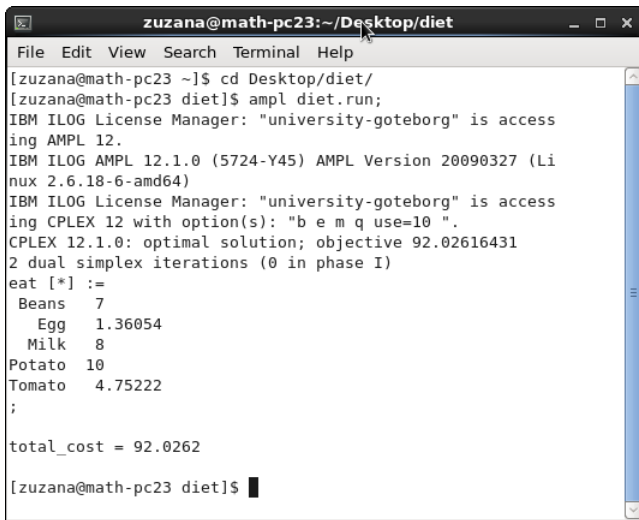
# The Diet Problem—AMPL implementation

- Open a Terminal window
- Go to the folder *diet*
- Evaluate the commands in the run file *diet.run* by AMPL



```
zuzana@math-pc23:~/Desktop/diet
File Edit View Search Terminal Help
[zuzana@math-pc23 ~]$ cd Desktop/diet/
[zuzana@math-pc23 diet]$ ampl diet.run;
```

# The Diet Problem—AMPL implementation



```
zuzana@math-pc23:~/Desktop/diet
File Edit View Search Terminal Help
[zuzana@math-pc23 ~]$ cd Desktop/diet/
[zuzana@math-pc23 diet]$ ampl diet.run;
IBM ILOG License Manager: "university-goteborg" is access
ing AMPL 12.
IBM ILOG AMPL 12.1.0 (5724-Y45) AMPL Version 20090327 (Li
nux 2.6.18-6-amd64)
IBM ILOG License Manager: "university-goteborg" is access
ing CPLEX 12 with option(s): "b e m q use=10 ".
CPLEX 12.1.0: optimal solution; objective 92.02616431
2 dual simplex iterations (0 in phase I)
eat [*] :=
  Beans      7
  Egg       1.36054
  Milk       8
  Potato    10
  Tomato    4.75222
;

total_cost = 92.0262

[zuzana@math-pc23 diet]$
```

# The Diet Problem—AMPL implementation

- Perform sensitivity analysis
- Preserve the sensitivity analysis information
- Use suffices for sensitivity analysis: `.rc`, `.slack`, `.dual`, ...

```

# Run file for the diet problem

model diet.mod;
data diet.dat;
options solver cplexamp;

option cplex_options 'sensitivity'; # preserve the sensitivity
option presolve 0;                 # do not reduce the problem
option solve;                       # analysis information

solve;                               # solve the problem

display eat;                         # display the optimal solution
display total_cost;                 # display the optimal value
display nutr_cont.dual;             # display the optimal dual values
display food_max.slack;            # display slack variables
display eat.rc;                    # display reduced costs

```

-.\*\*\*- diet.run All L17 (Fundamental)

# The Diet Problem—AMPL implementation

- Change type of variables: *integer*, *binary*, ...

```

# Model file for the diet problem

set FOOD;                # index set for foods
set NUTR;                 # index set for nutrients

var eat {j in FOOD} integer >= 0;

param cost {FOOD} > 0;   # price of foods [SEK/hg]
param eat_max {FOOD} > 0; # maximum daily amount of food [hg]
param cont {NUTR,FOOD} >= 0; # amount [g,\mu g,mg] of nutrient in 1hg of food
param n_min {NUTR} >= 0; # minimum daily amount of nutrition [g, \mu g, mg]
param n_max {i in NUTR} >= n_min[i]; # maximum daily amount of nutrition

minimize total_cost:
  sum {j in FOOD} cost[j] * eat[j];

subject to nutr_cont {i in NUTR}:
  n_min[i] <= sum {j in FOOD} cont[i,j] * eat[j] <= n_max[i];

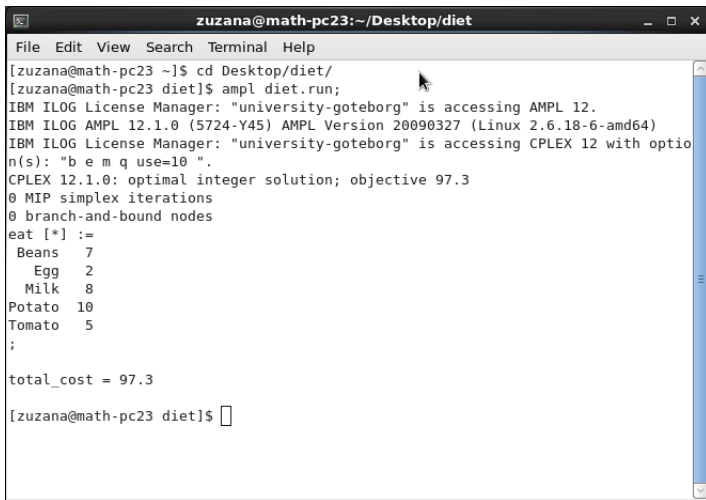
subject to food_max {j in FOOD}:
  eat[j] <= eat_max[j];

-**- diet.mod All L6 (Modula-2)
  
```

- The sensitivity analysis as described is possible only for linear programs in continuous variables (not for integer/binary; this is due to the theoretical properties)

# The Diet Problem—AMPL implementation

- Solution to the integrality constrained model



```
zuzana@math-pc23:~/Desktop/diet
File Edit View Search Terminal Help
[zuzana@math-pc23 ~]$ cd Desktop/diet/
[zuzana@math-pc23 diet]$ ampl diet.run;
IBM ILOG License Manager: "university-goteborg" is accessing AMPL 12.
IBM ILOG AMPL 12.1.0 (5724-Y45) AMPL Version 20090327 (Linux 2.6.18-6-amd64)
IBM ILOG License Manager: "university-goteborg" is accessing CPLEX 12 with optio
n(s): "b e m q use=10 ".
CPLEX 12.1.0: optimal integer solution; objective 97.3
0 MIP simplex iterations
0 branch-and-bound nodes
eat [*] :=
  Beans  7
   Egg  2
   Milk  8
  Potato 10
  Tomato 5
;

total_cost = 97.3

[zuzana@math-pc23 diet]$
```

# The Diet Problem—AMPL implementation

- Print results on a file

```

# Run file for the diet problem

model diet.mod;
data diet.dat;
options solver cplexamp;

option cplex_options 'sensitivity'; # preserve the sensitivity
option presolve 0; # do not reduce the problem
option solve; # analysis information

solve; # solve the problem

display eat; # display the optimal solution
display total_cost; # display the optimal value
display nutr_cont.dual; # display the optimal dual values
display food_max.slack; # display slack variables
display eat.rc; # display reduced costs

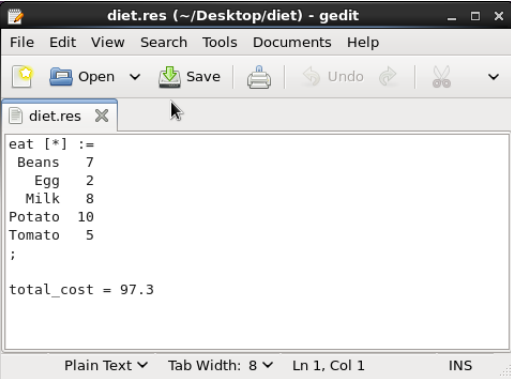
# Print interesting results on the file diet.res
display eat > diet.res;
display total_cost > diet.res;

```

-:--- diet.run All L22 (Fundamental)

# The Diet Problem—AMPL implementation

- The file *diet.res* is found in the folder *diet*



```
eat [*] :=
  Beans 7
  Egg 2
  Milk 8
  Potato 10
  Tomato 5
;

total_cost = 97.3
```

## Other useful AMPL commands

- AMPL options:

*option ...;*

- CPLEX options:

*option cplex\_options ...;*

- Define higher dimensional parameters:

*param a:= [1,\*,\*]: ... := ...  
          [2,\*,\*]: ... := ...;*

- Set parameter value from run file:

*let param[i]:= 0;*

- Display information in terminal window:

*print "...";*

- *if (...) then {...} else if (...) then {...};*

- *for {i in I} {...};*

- *break;*



# Assignment 1: Biofuel supply chain

Chalmers University of Technology  
University of Gothenburg  
Mathematical Sciences  
Optimization  
Zuzana Nedělková  
Ann-Brith Strömberg  
Caroline Granfeldt

MVE165  
MMG631  
Linear and integer optimization  
with applications

Assignment information  
March 16, 2017

## Assignment 1: Biodiesel supply chain

Below is a description of the biodiesel supply chain problem such that the total profit from supplying the demand of biodiesel is maximized. The assignment tasks are to

- formulate a linear optimization model of the problem described,
- solve the problem using AMPL and CPLEX, and
- analyze the results and answer a number of given questions.

Study the Modeling Language for Mathematical Programming AMPL and the solver CPLEX using the following links or the recommended exercise on linear optimization and software from the course homepage before you start solving the exercises.

<http://www.ampl.com/BOOK/download.html>  
<http://www.ampl.com/BOOKLETS/amplcplex122userguide.pdf>

To pass the assignment you should (in groups of two persons) give satisfactory answers to the following questions in a written report in the form of a PDF file. You should write the report on a computer, preferably using LaTeX. You shall also estimate the number of hours spent on this assignment and note this in your report. You may discuss the problem with other students. However, each group must hand in their own solution. The report will be checked for plagiarism via <http://www.urkund.com>. The questions 1, 2, and 3a-3f are mandatory. In addition, students aiming at grade 4, 5, or VG must answer the questions 3g-3h.

The file containing your report shall be called `Name1-Name2-Ass1.pdf`, where "Name $k$ ",  $k = 1, 2$ , is your respective family name. **Do not forget to write the authors' names also inside the report.** The report should be 3-4 pages long excluding illustrating diagrams and it should be

**submitted in PingPong at latest Wednesday 5th of April 2017, 23:55.**

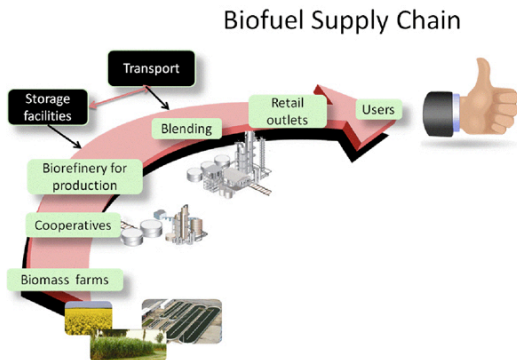
# Biofuel supply chain

- Reduce oil dependence
- Reduce greenhouse effect and climate change
- Substitute fuel in transportation sector
- Biofuels can be used in existing cars
- EU quotas to use
  - 10% of energy in transport. from renewable sources by 2020
  - 5% of biodiesel in diesel fuel from 2003
- Food versus fuel debate . . .
- Develop a mathematical model of the biofuel supply chain

# Biofuel supply chain

The value chain typically includes:

- Feedstock production
- Biofuel production
- Blending
- Distribution
- Consumption



# Assignment 1: Biodiesel supply chain

- Biodiesel supply chain problem
  - Maximize the total profit
  - Supply the demand of biodiesel
- Tasks
  - Formulate linear optimization model
  - Model and solve the problem using AMPL and CPLEX
  - Perform sensitivity analysis

# Crops

- Data
  - Available area
  - Soya, Sunflower, Cotton
  - Each crop yields expected amount of seeds
  - Each crop has water demand
  - Available water
- Processes
  - Extraction of vegetable oils from seeds (given yields)
  - Transesterification: vegetable oil + methanol = biodiesel (given proportions)
  - Purchase methanol (given price)

# Final Products

- Data
  - B5, B30, B100
  - Each product has price
  - Each product is subject to tax (higher amount of biodiesel  $\Rightarrow$  lower tax)
  - Demand of fuels to be delivered
- Processes
  - Blending of biodiesel and petrol diesel
  - Purchase petrol diesel (given price and availability)

# Sensitivity analysis






- Analyze results and answer several important questions without changing the model
- How sensitive is the optimal solution and the optimal value to changes in the data?
  - *Reduced costs* of a non-basic variable: the change in the objective value when the value of the corresponding variable is (marginally) increased
  - *Shadow price* of a constraint: the change in the optimal value when the RHS is (marginally) changed; equals the optimal value of the corresponding *dual variable*
  - The optimal value of the *slack variable* of a constraint indicates how much the RHS can be reduced while staying feasible
- Use these tools to answer the questions

# Cetane number

- The quality of pure biodiesel is given by the cetane number
- The cetane number depends on the quality of crops
- Requirements for the quality of each product should be incorporated in the model



# Literature

-  R. Fourer, D.M. Gay, and B.W. Kernighan, *AMPL: A Modeling Language for Mathematical Programming*, Duxbury Press, 2003, <http://www.ampl.com/BOOK/download.html>
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-  Ch. Papapostolou, E. Kondili, J. K. Kaldellis, *Development and implementation of an optimisation model for biofuels supply chain*, *Energy*, Volume 36, Issue 10, October 2011, Pages 6019–6026
-  J. Lundgren, M. Rönnqvist, P. Värbrand, *Optimization*, Studentlitteratur AB, Lund, 2010