
Environmental Modelling, 2009-2010

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1. General course information

Environmental Modelling, third year Bachelor course, Department of Physical Geography, Utrecht University, the Netherlands

- Course name: Environmental modelling
- Code: GEO3-4302
- ECTS-points: 7.5
- Level/'categorie'/'niveau': 3
- Period: 7-09-2009 t/m 07-11-2009
- Contact hours per week: appr. 10 h (first part), 0 h (second part)
- Language: English (Dutch if all participants speak Dutch)

- Internet site: <http://karssenberg.geo.uu.nl/environmentalModelling>, <http://webct.uu.nl>

Download this website as a pdf file [<downloads/eml.pdf>]

To front page [<http://karssenberg.geo.uu.nl/environmentalModelling>]

2. Announcement, recent changes

If you did not follow SAGIS1/RAGIS1 consider doing the following exercises from the Map Algebra course:

- 2.1
- 2.2.1-2.2.7
- 2.4.1
- 2.4.2
- 2.5.1
- 2.5.2
- 2.5.3

3. Course coordinator and lecturers

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4. Course content, prerequisites and aims

4.1. Content

The course provides an introduction to modelling of environmental processes in space and time, with emphasis on processes studied in the fields such as physical geography, ecology, (geo)hydrology, land degradation research, geodynamics of coastal and river systems, and

geodynamics of soil and water systems. The course provides a theoretical background for constructing and using computer models to represent environmental processes. Using this theoretical background, the student will evaluate models using different types of software tools for spatio-temporal modelling. At the end of the course, each student works on his/her own modelling case study, dealing with all steps in model development and application.

The course provides an introduction to the theory of different approaches to represent spatio-temporal environmental systems with a computer model. Topics which will be covered are: position of models in the earth- and biosciences, concepts of spatial dynamic modelling, identification of the model structure, bottom-up and top-down modelling, deterministic and stochastic modelling, discretisation of the three dimensional space and time, numerical solution of differential equations, storage based modelling, modelling of plant growth and interaction, cellular automata, spatial interaction: flow and spatial friction networks. In addition, the course deals with concepts available for modelling of specific environmental systems, such as surface and groundwater flow models, plant growth models, sedimentological models and land degradation models. In addition, the course provides an introduction to the concepts and mathematical foundations for evaluating the quality and applicability of a certain model for a specific application. This part of the course covers theory of different methods for sensitivity analysis (local and global), calibration and validation of a model and the choice of the appropriate representation of environmental processes given a certain goal and data availability in a modelling case study.

Students apply the theory in model construction and evaluation of several environmental models. For construction and running the models, a programming language (Python) and an environmental modelling language (PCRaster) will be used, in addition to standard software for data management. The course provides an introduction to the use of the Python programming language (see <http://www.python.org>) for constructing models and management of spatial and temporal data. Topics dealt with are principles of programming languages, data types and operators, reading and writing files, control flow (loops, conditions) and functions. The concepts of the PCRaster modelling language (see <http://pcraster.geo.uu.nl>) for construction of spatial temporal models are explained, and applied in computer classes using on-line (interactive) course material. For other types of modelling procedures, it might be needed to use additional software tools, such as 'off the shelf' models, software for groundwater modelling (e.g. MODFLOW), or software for calibrating models (e.g. PEST). These tools are provided for students interested in these topics.

The course is concluded by a 2-3 weeks case study, whereby each student works on his or her own modelling study, dealing with all steps of modelling. Each student will compile a written report of this case study.

4.2. Relation with other courses in the Utrecht Earth Sciences curriculum

The course builds upon 1) the static spatial modelling (map algebra) component of the 2nd year bachelor course SAGIS1/RAGIS1 (Spatial Analysis and GIS1) by teaching spatial modelling through time and 2) a large number of Bachelor courses that include components related to earth systems modelling. It provides a general introduction to theory and practice of process based modelling required for MSc tracks in physical geography (e.g. coastal and fluvial systems, quaternary geology and climate change, natural hazards and earth observation), geology (in particular earth surface processes and sedimentology), ecology, and geocomputation.

4.3. Background required to follow the course

You need to have a background at Bachelor level in one of the earth sciences, environmental sciences or ecology and basic knowledge of statistics and mathematics. In addition, it is desirable to have background in static spatial modelling, preferably SAGIS1 or another course that deals with spatial analysis (GIS course, introductory modelling course). If you do not have a background in static spatial modelling, you can participate, but it is recommended you do some extra exercises at the start of the course (workload approximately 2 days). For additional information regarding required background knowledge, email the course coordinator.

4.4. Prerequisites

None. But see above 'Background required to follow the course'.

4.5. Course aims

The aim of the course is to understand the theory and practice of spatio-temporal modelling of environmental systems (i.e. earth systems with focus on earth surface processes). The course will teach you theory of modelling in space and time, how to construct a model and how to evaluate the quality of a model against real world data. In a case study, you will apply this knowledge and you will learn how to write a scientific paper reporting results of a modelling study. The course tries to be general in the sense that it does not focus on specific fields of the earth sciences.

5. Content

5.1. Model Theory I

Theory of environmental modelling, introduction

Self study (literature)

Marking: written exam ('toets/test 1')

5.2. Model Building

Building dynamic models with PCRaster

Self study (literature), computer practicals

Marking: computer practicals (report), written exam ('toets/test 1')

5.3. Programming

Programming and model construction with Python

Self study (literature), computer practicals

Marking: computer practicals (report), written exam ('toets/test 2')

5.4. Model Theory II

Theory of environmental modelling: model structure identification, calibration, sensitivity analysis and model evaluation, Monte Carlo simulation

Marking: written exam ('toets/test 2')

5.5. Case Study

5.5.1. Introduction

Each couple of students will do a case study, using the tools and theory taught in the first part of the course. A report (per couple) is written on the case study. The following section gives case studies to choose from. Note that there is a limited number of couples that can do the same case study. If you subscribe late, it might be that the topic of your choice is not available anymore.

Choose a case study as soon as possible, the earlier you start with it, the more time you will have! Email Derek the code (e.g. CARU) of the topic you choose, including the two names of the students who will do the case study. It is not possible to work in groups of 3 students or alone!!

After choosing the case study, write down the concepts of your model (approximately 1 page: model structure, size of map, cell size, aim of the study, content of the study, possible problems) and email it to Derek (or put it in his paper mailbox). Make an appointment to discuss it with him (15 minutes). These 15 minute appointments will be in the week of 3 Oct (detailed schedule on the message board). If you do not make an appointment on one of these days, further help for the case study is NOT provided.

After this short talk on your case study, you will not get much supervision. Please do not pass by at Derek's room without making an appointment with him. See also Section 11, "Contacting your tutors"

5.5.2. Topics to choose from

This list is subject to change! Final list will be distributed during the course.

Code: CARU

Topic: Calibration of a PCRaster model

Keywords: calibration, PCRaster, PEST, Python

Aim: to calibrate parameters of a rainfall-runoff model with the automatic parameter estimation software PEST. PEST

Description: PEST is software that allows you to calibrate a dynamic model using automatic calibration schemes. The advantage over manual adjustment of parameters is that it results in a better estimation of parameters. PEST is generic software, and it can be linked to any PCRaster model, sometimes with some additional programming. The aim is to calibrate one or two parameters of an existing PCRaster model. You can choose the model yourself (or Derek can provide one). The topic involves some Python programming, and some literature study regarding PEST (available manual).

Literature: PEST manual, available in Derek's room

Code: FOFI

Topic: Forest fire model

Keywords: PCRaster, cellular automata

Aim: to create a forest fire model and perform a sensitivity analysis on its parameters

Description: Forest fires can be simulated with cellular automata. Create a dynamic cellular automata model in PCRaster simulating (a) spreading forest fire(s) as a result of lightning(s). Make the speed of forest fire spreading dependent on vegetation type, geomorphology and/or wind. Perform a sensitivity analysis to evaluate the effect parameter values on the pattern and velocity of forest fire spread.

Literature:

Regarding the model: Gaylord, R. J. and K. Nishidate (1996). Modeling nature : cellular automata simulations with Mathematica. Santa Clara, CA, Telos., p. 159.

Other articles can be found in the Environmental Modelling reader or in the library.

Regarding the data set:

Surf to <http://www.virtualland.geo.uu.nl> (use logging: fg, password: virtualland) and read exercises -> Ecology -> grazing study. You don't need to understand the grazing study and the (grazing) models described. Read it just to get some knowledge of the area and the dataset used.

Additional information regarding the data set (if required) is at <http://www.sluitertijd.org>, a report written about the area. Go to 'study' -> Fieldwork Crete (pdf file).

Downloads: fire.zip file with data set [downloads/casestudy/fire.zip]

Code: VFRI

Topic: Extraction of hydrodynamic vegetation friction values from in situ measurements

Keywords: Python, Numarray module of Python, hydrodynamics

Aim: to extract a robust hydrodynamic friction value from measurements

Description: Vegetation friction is a very important input parameter for hydrodynamic flow models on which the safety standards of river embankments are based. During high water in Januari 2004 a new and innovative measurement scheme has successfully been tested: 3D float tracking. This has resulted in measurements with unprecedented detail. Still it is a challenge to extract a robust friction value from this data. The aim is to program a spatial operator that can compute friction values on various spatial extents based on detailed measurements of flow velocity, water depth and water surface height. See also the downloadable literature below.

Literature: FieldCampaignRhine.pdf [downloads/casestudy/FieldCampaignRhine.pdf], and literature provided by Derek

Downloads: data provided by Derek

Code: MORA

Topic: The effect of moving rainstorms on catchment hydrographs

Keywords: PCRaster, rainfall-runoff modelling

Aim: to study the effect of a heterogeneous and temporally variable distribution of rain on catchment discharge

Description: Event-based rainfall-runoff models simulate the discharge in a catchment during one single rainstorm. An example is the 'manning' exercise in the Dynamic Modelling computer practicals. In most cases, these models assume a homogeneous distribution of rain over the catchment. The first aim of this topic is to extend the PCRaster model used in the 'manning' exercise with a module that is capable to simulate a rainstorm with a certain radius moving over the catchment, where different velocities of movement and directions of movement can be simulated. The second aim is to use this model to study the effect of rainstorm velocity and direction of movement (e.g. upstream or downstream) on characteristics of the hydrograph (e.g. peakflow, shape of hydrograph) at the outflow point. It is important to find a proper way to study and report these effects in tables/figures: it is recommended to run the model several times (in batch, e.g. use a Python script) using different values of rainstorm velocity and direction.

Literature: Ogden, F. L., J. R. Richardson and P. Y. Julien (1995), 'Similarity in catchment response. 2. Moving rainstorms.' Water Resources Research 31(6): 1543-1547 (available in the library). This paper gives several references to other literature that could be used.

Downloads: use the data set provided in the 'manning' exercise that you used during the PCRaster practicals

Code: ECO_COMP

Topic: Dispersal of two plants with competition

Keywords: PCRaster, ecology

Aim: to construct a spatial model simulating growth and dispersal of two plants

Description: Growth and competition between two species (e.g. trees) can be simulated with growth and competition equations. A PCRaster model with explanation is available simulating these kind of processes. The model simulates the competition between a fast growing plant which is replaced by a slower growing plant. The aim of this topic is to convert this model to a spatial version, including the same competition equation, and in addition two functions simulating dispersal: assume that one

species disperses by seed dispersal (like in the 'plants' model in the exercises), while the other plant disperses by clonal growth (simulated with a cellular automata approach).

Literature: As an introduction, do the exercises at <http://www.virtualland.geo.uu.nl>, first install the software (read the instruction at the opening page!), go to exercises, and read and run the section 'Growth'. The aim is to extend the models described here with dispersion.

Downloads: you can use the 'plants' data set (dynamic modelling exercises). As a starting point, use the point model (1 x 1 cell) woods1d-ort.mod (also used in the exercises on virtualland) in this zip file: [competition.zip](#) [[downloads/casestudy/competition.zip](#)]

Code: RHINE

Topic: Modelling the discharge of the river Rhine

Keywords: PCRaster, hydrology, some Python

Aim: to construct and calibrate a model simulating the discharge of the Rhine

Description: the discharge of the river rhine catchment at the Dutch village of Lobith can be modelled with timeseries data of rainfall and potential evaporation for a large number of measurement stations in the catchment of the Rhine. The aim of this topic is to construct a spatial dynamic model simulating the discharge of the Rhine on a daily or weekly time step. Construct the model yourself using your knowledge of hydrology and if needed search some literature. Calibrate model parameters (manually) by comparing the modelled discharge with measured discharge at 5 measurement stations.

Literature: Not provided.

Downloads: Use the data provided in the zip file [emRhineDataSet.zip](#) [[downloads/casestudy/emRhineDataSet.zip](#)]. Unzip the file and read the file [readme.txt](#) for a description of the files. Be sure to have quite some disk space available (preferably some gigabytes).

Code: DEBSSENS

Topic: Propagation and deposition of mud and debris flows: scenario and sensitivity study

Keywords: PCRaster, mass movements

Aim: to perform a sensitivity analysis on a debris flow model and to evaluate scenarios of input

Description: A PCRaster model for simulating the kinematics of mud and debris flows was developed by Santiago Begueria-Portugues and Theo van Asch. The model simulates the initiation and transport of a single debris flow over a digital elevation model. It is physically based. In this topic you need to study a paper describing the concepts of the model. Using a provided data set, study the relation between model inputs, such as the location of initiation of the debris flow, the size of the debris flow and model outputs, in particular the area covered by the deposit of the debris flow. Take into account the effect of parameter uncertainty.

Literature: email Derek for a research paper on the model

Downloads: use the model and data set included in [debrisFlows.zip](#) [[downloads/casestudy/debrisFlows.zip](#)]

Extra download: for this model you need the most recent version of pcrcalc which is not in the standard distribution. To get this pcrcalc version, download [newcalc.zip](#) [[downloads/newcalc.zip](#)] and unzip its contents to the subdirectory (folder) containing the debris flow model. Run the model in this folder only and it works.

Code: DEBGEO

Topic: Propagation and deposition of mud and debris flows: the evolution of a debris flow fan

Keywords: PCRaster, Python, mass movements

Aim: to model the evolution of a debris flow fan through time

Description: A PCRaster model for simulating the kinematics of mud and debris flows was developed by Santiago Begueria-Portugues and Theo van Asch. The model simulates the initiation and transport of a single debris flow over a digital elevation model. It is physically based. In this topic you need to study a paper describing the concepts of the model. Using a provided data set, you need to construct a model that simulates a sequence of debris flows (e.g. 10-100 debris flows) generating a debris flow fan. This is done by running the existing debris flow model multiple times (by calling the existing model several times from a Python script), each time calculating the thickness of debris flow deposit, adding it to the dem, and running the next debris flow. The result is a model simulating a set of debris flows whereby the digital elevation model changes over geological time scales.

Literature: email Derek for a research paper on the model

Downloads: use the model and data set included in debrisFlows.zip [downloads/casestudy/debrisFlows.zip]

Extra download: for this model you need the most recent version of pcrcalc which is not in the standard distribution. To get this pcrcalc version, download newcalc.zip [downloads/newcalc.zip] and unzip its contents to the subdirectory (folder) containing the debris flow model. Run the model in this folder only and it works.

Code: CHBE

Topic: Alluvial architecture modelling

Keywords: PCRaster, sedimentology

Aim: to construct a model simulating the temporal evolution of a floodplain

Description: Alluvial architecture models simulate the deposits from river sedimentation and erosion in three dimensions. One approach is to use a spatial dynamic model. This topic aims at constructing such a model, following the concepts of the models developed by Bridge and co-workers. Such a model is described in one of the articles in the reader. Since these kind of models are quite difficult to program, you will develop a simplified version, ignoring compaction and simplifying the avulsion process. Include the following processes: channel belt deposition, overbank deposition, (nodal) avulsion, fixed avulsion interval (so, each time step in the PCRaster script represents a fixed time interval, and each timestep, an avulsion occurs), growth in channel belt width (if possible). Follow the equations given in Mackey et al (see below).

Literature: Mackey, S. D. and J. S. Bridge (1995), 'Three-dimensional model of alluvial stratigraphy: theory and application.' *Journal of Sedimentary Research* B65(1): 7-31. Bridge, J. S. (1999). Alluvial architecture of the Mississippi valley: predictions using a 3D simulation model. *Floodplains: Interdisciplinary Approaches*. S. B. Marriott and J. Alexander. London, Geological Society. 163: 269-278.

Downloads: use a virtual data set (create a map yourself, not too big!)

Code: COCA

Topic: coastal modelling

Keywords: model construction, python

Aim: to construct a profile model of coastal evolution

Description: The aim is to construct a model simulating the change in height and depth of waves approaching the coast as a function of bathymetry and wave dynamics. The model structure will be based upon existing models simulating this process, although a more simplified version will be used.

Literature: Articles provided by Derek

Downloads: -

Code: GENA

Topic: Genetic algorithm

Keywords: Python, inverse modelling (calibration)

Aim: to develop a program of a genetic algorithms and to apply it to a simple case study

Description: Een van de belangrijkste doelen bij environmental modelling studies is om de uitkomsten van een computer model overeen te laten komen met in het veld gemeten gegevens. Dit doel wordt in de meeste gevallen bereikt door het aanpassen van de invoer van het model, met name de model parameters, totdat de uitvoer van het model goed overeenkomt met gemeten waarden in het veld. Deze procedure waarbij model parameters worden aangepast heet calibratie van een model. Een voorbeeld hiervan is de calibratie van een regen-afvoer model, waarbij een infiltratie parameter (b.v. verzadigde doorlatendheid) wordt aangepast totdat de afvoer in een beek gesimuleerd door het model overeenkomt met de gemeten afvoer. Er zijn vele andere voorbeelden denkbaar. In alle gevallen gaat het om het zoeken naar een meest optimale invoer voor een model. Om de calibratie optimaal uit te voeren zijn calibratie algorithmes en software ontwikkeld, die een model automatisch calibreren. Een interessant en veelbelovend algoritme wat tot nu toe nog relatief weinig wordt toegepast in de fysische geografie zijn 'genetic algorithms'. Zoals de naam al aangeeft, gebuiken genetic algorithms principes uit de evolutie biologie (genen, recombinitie, crossover) om een model te calibreren. Hierbij wordt een model gezien als een organisme, dat zich ontwikkelt tot een optimale 'fitness' is bereikt. Het blijkt dat in bepaalde gevallen, genetic algorithms zeer efficiënt zijn voor het calibreren van een model. Een korte inleiding met demos die het principe van genetic algorithms illustreren kan gevonden worden op <http://www.obitko.com/tutorials/genetic-algorithms/>. Dit onderwerp heeft als thema de toepassing van genetic algorithms in calibratie van landschappelijke modellen. Ten eerste wordt een simple genetic algorithm geprogrammeerd in Python. Vervolgens wordt het toegepast op een simpel model.

Literature: Haupt, R. L. and S. E. Haupt (1998). Practical genetic algorithms. New York, Wiley. Second chapter, the book is available in Derek's room or in the library. Additional books (if needed) are available in the library. Lots of info is also on the internet!

Downloads: none

Code:GWFL

Topic: Groundwater flow modelling

Keywords: PCRaster, MODFLOW

Aim: to learn how to create a groundwater flow model

Description: Groundwater flow modelling is currently not possible in PCRaster. It is mostly done in specially developed software with pre-programmed routines that solve the groundwater flow equations. In this topic, you will use the software package MODFLOW. MODFLOW comes with an easy to use graphical interface that can be used to construct models. The topic includes 1) literature study to learn something about groundwater flow modelling (some chapters from a book provided by Derek), 2) doing the exercises Groundwater flow modelling with GIS (step by step exercises that learn you how to use MODFLOW, using a data set from the 'Utrechtse Heuvelrug'), 3) writing a report on how MODFLOW works and a small additional study that you will do with the model (e.g. a sensitivity analysis). This topic is interesting when you want to know more about hydrology and groundwater flow modelling.

Literature: from Anderson, M. P. and W. W. Woessner (1993). Applied groundwater modeling simulation of flow and advective transport. San Diego, Calif., Academic Press, read the chapters 2, 3.1, 3.2, 3.3 (emphasis on finite difference grids), 3.4, box 3.1, 4.1, 4.2, 4.3, box 4.1 (MODFLOW part), 5.1, 5.2, 5.3, 11.1, 11.4

Practicals groundwater flow modelling (available in Derek's room).

Downloads: gwfl.zip [downloads/casestudy/gwfl.zip]

Code: PYGIS

Topic: Create a raster GIS

Keywords: Python, software development

Aim: to create generic spatial functions on raster maps

Description: The aim is to make your own raster based modelling language using the Python programming language. Develop several functions in Python which operate on raster maps, returning one or more raster maps. By combining these, write a simple static or dynamic model.

Literature:

Downloads:

Code: RARUFR

Topic: Calibrate the event-based rainfall-runoff model of the Hauteville VWK1 catchment

Keywords: PCRaster, Python, rainfall-runoff modelling

Aim: to calibrate a rainfall-runoff model to measured discharge data

Description: Event-based rainfall-runoff models simulate the discharge in a catchment during one single rainstorm. An example is the 'manning' exercise in the Dynamic Modelling computer practicals. In this topic, you will use an existing rainfall-runoff model running in PCRaster. It was also used during VWK1 (but here you will use it without interface). The model will be run for the Hauteville catchment. Calibration can be done using measurements of rainfall and discharge in 2003. The following steps need to be done: rainfall and discharge data are available in spreadsheets. These need to be converted to timeseries in the format of PCRaster, where each timestep is 10 seconds. Write a Python program that does the job. After this, run the model with the measured (or parts of the measured) rainfall timeseries and compare the simulated discharge with the measured. Try to calibrate the model (by manual adjustment). Note that most measured discharge is baseflow, so you will need to subtract baseflow to compare it with the output of the model (simulating surface runoff only).

Literature: VWK1 reader with description of the model

Downloads: The file france_model.zip [downloads/casestudy/france_model.zip] contains the model that you can use. It includes tables that you need to modify with the appropriate values. The maps are from a different catchment. Replace the maps with the maps in the file france_maps.zip [downloads/casestudy/france_maps.zip]. The measured rainfall and discharge is in the file france_measurements.zip [downloads/casestudy/france_measurements.zip]. Be sure to read the explanation in the attached pdf!

Code: MCSI

Topic: Error propagation modelling through Monte Carlo simulation

Keywords: PCRaster, Python, error propagation

Aim: to write a Python program capable to run an existing PCRaster model in Monte Carlo simulation mode

Description: Error propagation modelling involves the estimation of the error in the output of a model as a result of errors in input values of parameters. Monte Carlo simulation is a method for error propagation modelling that runs a model several times, each time using a slightly different input value of a parameter. These different input values represent the uncertainty range in the input parameter. Each time the model is run, a different output is generated. By collecting all these

outputs, the variation in the outputs can be calculated which is an indication of the uncertainty in the model as a result of the uncertainty in an input. Since PCRaster does not provide a standard way to run a model several times (in Monte Carlo mode), the aim is to write a (small) Python program that runs a PCRaster model several times, each time using a different input. This program is applied to a simple model (choose one yourself, e.g. from the PCRaster practicals), to evaluate the error in the output as a result of the error in the input.

Literature: one paper describing the concept of Monte Carlo simulation (note that one of the topics of the last two lectures is Monte Carlo simulation, so you will already know about it)

Downloads: none

Code: DAISY

Topic: Modelling Daisyworld

Keywords: PCRaster, cellular automata

Aim: to develop a spatial Daisyworld model and to evaluate different input scenarios

Description: Daisyworld was introduced by James Lovelock and Andrew Watson to illustrate the plausibility of the Gaia hypothesis in a paper published in 1983. It is a computer simulation representing a hypothetical world with an slowly increasing incoming solar radiation. In the original version of the model, the planet contains two different species of daisy as its only life form: black daisies and white daisies. White daisies have white flowers which reflect light, and the other species has black flowers that absorb light. Both species have the same growth curve but the black daisies result in a warmer atmosphere than white daisies or bare earth. As a result, a planet with preponderance of white daisies is cooler than one with more black ones. Daisyworld simulation is an analogy which shows that life which is adapted to certain kind of environmental conditions by its mere existence slightly (or more) regulates its own environment toward living conditions which are suitable for life. For additional info, see for instance wikipedia (search on Daisyworld). The aim of this topic is to develop a spatial Daisyworld model containing 2 or more species. Using this model, different scenarios of model parameters and incoming solar radiation can be evaluated.

Literature: a lot of literature on Daisyworld can be found by a search in for instance <http://www.scopus.com>. Of particular interest for this topic are: Ackland et al (2003), Catastrophic desert formation in Daisyworld, *Journal Theoretical Biology*, 223: 39-44, and the report on 'Modeling the Gaia Hypothesis' available at <http://www.cs.utoronto.ca/~phillipa/>

Downloads: none, use one of the data sets used in the dynamic modelling exercises as starting point.

Code: OWN

Topic: alternative topic provided by you

Keywords: -

Aim: -

Description: if you have another idea for the case study, please suggest it to me, and I will see whether it is feasible.

Literature: -

Downloads: -

5.5.3. Report

A report is written on the case study by each couple of students (one report per 2 students). The maximum length is 7 pages (including figures). Put additional figures in an appendix (if needed). The report should be structured like a scientific article. Be sure to give an introduction, problem definition, aims, etc. See also Section 7.3, "Case study: written report"

The report may be written in Dutch or preferably in English.

5.5.4. Improving your report, often made errors

Below you find a list of errors that I often find in reports:

- Use Italics ('cursief') for all symbols in equations or in the text
- Preferably use a single letter (+ subscript if needed) for a variable in equations (e.g. do not use a symbol like COV)
- Do not write like in a diary ('First we did this,... Then we started to realize.. and we did this and that...'). Your report is not a poezieboek.
- Put larger blocks of computer code (say, more than 2 lines) in a table instead of inserting it in the main text. Whole programs should be given in an appendix.
- Use a main (cover) title that makes sense.
- Provide quantitative data in figures (bar graphs, line graphs, scatter plots, use e.g. Excel, Splus) instead of those boring unreadable tables.
- If you write the report with Microsoft Word, use Microsoft Equation editor (available in Word) for equations.
- Number equations - always (provide the number after the equation, e.g. (3)).
- Check out an article from a scientific journal (e.g. from your reader) and use that as an example for formatting, layout, use of figure captions, literature references, etc.
- Do not use language as if you are talking (spreektaal)
- Describe content in a logical order, instead of describing content in the order you dealt with it while modelling. So, do not use sentences like 'eerst deden we dit, toen zijn we dat gaan doen, etc..).
- Use a spellchecker (ALWAYS)
- A caption of a figure or table should at least explain all symbols used in the figure or table. The same holds for an appendix. In principle, the table/figure should be understandable without reading the main text (although there are exceptions to this rule)
- Provide a legend to a figure (always)
- If a figure contains a map, provide a scale (scale bar)
- Do not hand in black and white prints of color figures (NEVER)
- Use the same format for each reference in your literature list and refer to the references in the text.
- Number the sections in your report, provide these numbers also in the contents Preferably use some kind of hierarchical numbering, for instance 1 1.1 1.1.1 1.1.2 2 2.1 2.2 etc
- Number figures and tables. In the main text, refer to figures or tables by using these numbers.
- All literature referred to in the main text should appear in the literature/references section at the end of the report. Check this in detail before handing in!
- Do not mix past and present tense.

- Do not use 'I' or 'we' (1e persoon).
- If you use a figure from a book or another report, always provide the reference.
- Do not use English terminology in a report written in Dutch when correct Dutch terms are available (e.g. 'catchment' = 'stroomgebied')
- Provide units (all variables in equations)!
- Kort (vrijwel) nooit af! e.g. 'd.m.v.'.
- Do not use 'etc.'
- Provide page numbers.
- Use every page from top to bottom (apart from last pages of very long sections), do not include too much whitespace!
- Do not just copy-paste figures (maps) from screen. Adjust colors, add a legend, remove MS Windows bars, buttons, check size of text or modify text, etc. Use a graphics package (e.g. Freehand, Paintshop or whatever).
- Try to come up with interesting results (do not just list all results from your model, but try to emphasize the most interesting results). But note that this should always fit with the goals of your research (if needed adjust these goals).
- Use courier font for computer code, PCRaster scripts, or filenames. Also in the main text (not just in tables).
- Use a good dictionary. If you do not have one, buy one. I could recommend Longman Dictionary of Contemporary English (<http://www.longman.com/ldoce>). Or use the online version at <http://www.ldoceonline.com>
- Read through the text and correct all small (or large..) errors (typos for instance) before handing in!
- Do not use a title that ends with a '!'. For instance, do not use the title 'Discussie:'
- Do not come up with things in the Conclusions section that have not been described earlier in the paper.

6. Time table

6.1. Per week

Table 1. Time table

| week: | 37 | 38 | 39 | 40 | 41 (breekweek) | 42 | 43 | 44 | 45 |
|-------------|----|----|----|----|-------------------|----|----|----|----|
| Theory I | X | X | | | | | | | |
| Building | X | X | | | | | | | |
| Programming | | | X | X | | | | | |
| Theory II | | | | X | | X | | | |
| Case-study | | | | | X | X | X | X | |
| Report | | | | | | | | X | |

| | | | | | | | | | |
|-------------|--|--|--|---|--|---|--|--|---|
| 'Toets' | | | | X | | X | | | |
| 'Reparatie' | | | | | | | | | X |

6.2. Lectures per day

For rooms and starting times:

<http://www.geo.uu.nl/onderwijs/studentenvoorzie/studiepunt/roosters/bacheloraardwete/51469main.html>

All sheets are available as hardcopy, see Study material section

Some sheets are also available on-line (html), see downloads

Lectures, (subject to change)

- Lecture 1, Theory I

- Introduction to the course
- Introduction to Environmental modelling

Literature

- Karssenbergh, D., 2003, Introduction to dynamic spatial environmental modelling
- Jørgensen, S.E. and Bendoricchio, 2001, Concepts of modelling, in: Fundamentals of ecological modelling, Jørgensen, S.E. and Bendoricchio, 2001, p. 19-39, Elsevier, Amsterdam.
- Wainwright, J. and Mulligan, M., 2004, Modelling and model building, in: Environmental Modelling: finding simplicity in complexity, J. Wainwright, M. Mulligan (eds), p. 19-29, Wiley, Chichester.

- Lecture 2, Building

- Dynamic environmental modelling
- Model building with PCRaster

Literature

- Burrough, P. A., 1998, Dynamic Modelling and Geocomputation, in: Geocomputation: a primer, P. A. Longley, S. M. Brooks, R. McDonnell and B. MacMillan. Chichester, Wiley: p. 165-191.

- Lecture 3, Theory I

- Numerical solution of differential equations
- Example models

Literature

- Wainwright, J. and Mulligan, M., 2004, Modelling and model building, in: Environmental Modelling: finding simplicity in complexity, J. Wainwright, M. Mulligan (eds), p. 29-40, Wiley, Chichester.
- Jørgensen, S.E. and Bendoricchio, 2001, Differential Equations, in: Fundamentals of ecological modelling, Jørgensen, S.E. and Bendoricchio, 2001, p. 465-494, Elsevier, Amsterdam.
- Kreyszig, E., 1999, Numerical Methods for Differential Equations, in Advanced Engineering Mathematics, New York, N.Y., Wiley: p. 942-952.

- Lecture 4, Theory I

- Cellular automata
- Stochastic models

Literature

- **Karafyllidis, I. and A. Thanaklakis, 1997, A model for predicting forest fire spreading using cellular automata. Ecological Modelling v. 99: p. 87-97.
- Dehling, H. G. and J. N. Kalma, 1995, Waarover gaat het vak, Kansrekening: het zekere van het onzekere. H. G. Dehling and J. N. Kalma. Utrecht, Epsilon Uitgaven, p. 1-5.

- Lecture 5, Programming

- Introduction to programming
- Variables, expressions, statements, functions, conditionals

Literature

- Think Python, An introduction to software design, A. Downey, 2008

- Lecture 6, Programming

- Functions, iteration
- Strings
- Lists
- Files and exceptions

Literature

- Think Python, An introduction to software design, A. Downey, 2008

- Lecture 7, Theory II

- calibration

Literature

- Beven, K.J., 2002, Parameter estimation and predictive uncertainty, in Rainfall-runoff modelling the primer, K.J. Beven, Wiley: Chichester, p. 217- 254

- Lecture 8, Theory II

- Monte Carlo simulation, sensitivity analysis

Literature

- Beven, K.J., 2002, Parameter estimation and predictive uncertainty, in Rainfall-runoff modelling the primer, K.J. Beven, Wiley: Chichester, p. 217- 254

6.3. Computer classes per day (subject to change)

For rooms and starting times:

<http://www.geo.uu.nl/onderwijs/studentenvoorzie/studiepunt/roosters/bacheloraardwete/51469main.html> [<http://www.geo.uu.nl/onderwijs/studentenvoorzie/studiepunt/roosters/bacheloraardwete/51469main.html>]

6.4. Use of computer rooms for the case study

No rooms are reserved for your work on the case study. You need to reserve a computer yourself (in the rooms of the Unnikgebouw), or alternatively, work at home.

6.5. Important dates (tests, presentations, etc)

Dates given below might change, always check the following link for starting times and rooms: <http://www.geo.uu.nl/onderwijs/studentenvoorzie/studiepunt/roosters/bacheloraardwete/51469main.html>

Test 1: Sept 28th, 2009

Test 2: Oct 12th, 2009

Computer practicals Dynamic Modelling with PCRaster: finish all exercises on or before Sept 21nd, 2009

Computer practicals Python: finish all exercises on or before Oct 12th, 2009

Case study, choose topic before Oct 4th, email code of topic to Derek Karssenber

Case study, written report: hand in on or before Oct 30, 5pm (paper-mailbox Derek Karssenber)

Aanvullende of vervangende toets: 2-6 Nov, 2009

7. Tests and marking (subject to change)

7.1. Examinations ('tentamens')

Subject matter subject to change

Test 1

Subject matter ('tentamenstof'):

- Karssenber D, 2009, *Environmental Modelling, reader*, chapter 1 and 2. Learn these two chapters, but you do not need to *learn* the content of the papers indicated with a ** in the content section. Study these papers in detail, two times. You do not need to memorize ('uit het hoofd leren) these papers.
- Related overhead sheets of the lectures on Theory 1 and Building (first 4 lectures)
- Karssenber D, van Deursen WPA, Wesseling CG, van der Meer M, de Jong K, Burrough PA, 2000, *An introduction to dynamic modelling. PCRaster distance learning course material*.

Duration: 2 hours

The test is 'gesloten boek'. You get a mark between 1 and 10.

Test 2

Subject matter ('tentamenstof'):

- Karssenber D, 2009, *Environmental Modelling, reader*, chapter 3. Learn this, but you do not need to *learn* the content of the papers indicated with a ** in the content section. Study these papers in detail, two times. You do not need to memorize ('uit het hoofd leren) these papers.
- Related overhead sheets of the lectures on Python and Theory 2

- Karssenberg D, de Jong K, 2003, *Computer practicals Python for environmental modellers*. Distance learning course material.
- Think Python, An introduction to software design, A. Downey, 2008. Chapters 1, 2, 3, 5, 6, 7, 8, 10, and 14.

Duration: 2 hours

The test is 'gesloten boek'. You get a mark between 1 and 10.

7.2. Computer practicals

Computer practicals Dynamic Modelling with PCRaster

On-line submission (WebCT) of answers to questions, one set of answers (one login) per couple

Marking: 'voldaan', 'niet voldaan'

Computer practicals Python

On-line submission (WebCT) of answers to questions, one set of answers (one login) per couple

Marking: 'voldaan', 'niet voldaan'

7.3. Case study: written report

Written report, handed in as hard-copy (paper, digital versions are not accepted)

Marking: mark between 1 and 10

Items used for marking:

Research done

Aim of the research ('doelstelling')

Approach, work done

Discussion of results

Integration of literature and research

Conclusions

Presentation of the research

Use of tables, figures

Layout

Length of report

Spelling

Structure of report as a whole

Structure per (sub-)section

Readability

7.4. Calculation of final mark, additional assignments

For passing this course, you need to:

- attend *all* lectures and computer practicals Python and PCRaster
- submit answers to all questions of the computer practicals *before the deadlines*, see Section 6.5, “Important dates (tests, presentations, etc)”
- hand-in the written report of the case study *before the deadline*, see Section 6.5, “Important dates (tests, presentations, etc)”
- get an overall mark M of 5.5 or higher
- have a mark for the written report of 5.5 or higher

The overall mark is calculated as:

$$M = 0.25A + 0.25B + 0.5C \text{ (equation 1)}$$

with: M , the overall mark; A , the mark for 'Toets 1' (not rounded to whole values); B , the mark for 'Toets 2' (not rounded to whole values); C , the mark for the written report on the case study.

If you have an overall mark of 4 or 5 while fulfilling all other requirements for passing the course, you can do an additional assignment ('aanvullende of vervangende toets'). Note that the time to study for this additional assignment is short, so do everything to avoid that you get an overall mark of 5. The content and form (oral exam, written exam, report) of the additional assignment will be determined by Derek Karssenbergh (per student, the content and form depends on the marks for each of the sub-marks).

If you have (after the 'additional assignment') a final mark of 5 or lower, you need to do the course again next year.

If you cannot attend a lecture, computer practical or exam because you are ill or for other important reasons, please inform Derek Karssenbergh before the lecture, computer practical or exam. Email: <d.karssenbergh@geo.uu.nl>, telephone: 030 2532768.

8. Study material

Textbooks, syllabi

Think Python, An introduction to software design, A. Downey, 2008, , Green Tea Press, Needham, 234 pp. Soon available at 'verkoopruimte' (fourth floor W.C. van Unnikbuilding, appr. 11 Euro), online at <http://www.greenteapress.com/thinkpython>.

Karssenbergh D, 2007, *Environmental Modelling, reader*, soon available at 'verkoopruimte' (fourth floor W.C. van Unnikbuilding).

Computer practicals

Karssenbergh D, van Deursen WPA, Wesseling CG, van der Meer M, de Jong K, Burrough PA, 2000, *An introduction to dynamic modelling. PCRaster distance learning course material*, appr. 50 pp. This course will be done on-line (distance learning) using WebCT. Login using your SOLIS ID at <http://webct.uu.nl>. The same course (plain text, no interactive content) can also be found at (only from within the Utrecht University internet domain) <http://pcraster.geo.uu.nl/courses/contents> (select 'Dynamic Modelling').

Karssenbergh D, de Jong K, 2003, *Computer practicals Python for environmental modellers*. Distance learning course material, appr. 50 pp. This course will be done on-line (distance learning) using WebCT. Login using your SOLIS ID at <http://webct.uu.nl>. The same course (plain text, no interactive content) can also be found at (only from within the Utrecht University internet domain) <http://pcraster.geo.uu.nl/courses/contents> (select 'Python introduction').

Sheets

Karssenbergh, 2008, *Environmental modelling, overhead sheets*, soon available at the 'verkoopruimte' (fourth floor W.C. van Unnikbuilding). Some sheets are also available at the downloads.

9. Software

For the computer practicals

PCRaster for spatial dynamic modelling , info and software at <http://pcraster.geo.uu.nl>

Python programming language, info and software at <http://www.python.org>. Note that this software can be downloaded for free at the above-mentioned site. The software is also installed at the computer rooms, first floor W.C. van Unnikbuilding.

Other software (e.g. for case studies)

PEST for Model-Independent Parameter Estimation and Uncertainty Analysis info and software at <http://www.sspa.com/pest>

10. Downloads

10.1. Overhead sheets

Overhead sheets for all lectures need to be bought as hardcopy, see Study material section

Some of these sheets are also available as html:

Lecture 2, building [<downloads/sheets/building/index.html>]

Map Algebra, if you need to fresh up your knowledge on pccalc functions [<downloads/sheets/mapAlgebra/index.html>]

Lectures on Python [<downloads/sheets/python/index.html>]

10.2. Data for practicals

Data for PCRaster practicals: dynamic modelling (dynamic.zip) [<downloads/dynamic.zip>]

Data for Map Algebra practicals (not included in this course, mapalgebra.zip) [<downloads/mapalgebra.zip>]

11. Contacting your tutors

Questions related to the computer practicals Dynamic Modelling and Python: contact Derek or a 'student assistent' during the practicals

- during the computer practicals: ask Derek or student assistent
- outside computer practical hours: submit question to discussion list (in webct), questions are answered by other students, student assistenten or Derek

Case study

- If you need to discuss your case study, do not just pass by at Derek's room. Make an appointment first (preferably by email), preferably for a monday or tuesday afternoon (i.e., in the time slot of our course).
- general questions about how to use PCRaster, Python, or other software: 1) search in the manuals or on the internet, 2) ask a fellow student, 3) email Derek, or 4) make an appointment to discuss it with Derek (see above).

- specific questions related to your case study: Email Derek <d.karssenber@geo.uu.nl>, he will reply by email, or make an appointment with Derek (by email).

12. Links

<http://pcraster.geo.uu.nl>, PCRaster site

<http://www.python.org>, Python site

<http://pcraster.geo.uu.nl/courses/content> [<http://pcraster.geo.uu.nl/courses/contents>], site with courses in HTML or PDF format (NOTE: only accessible from the uu web domain!)