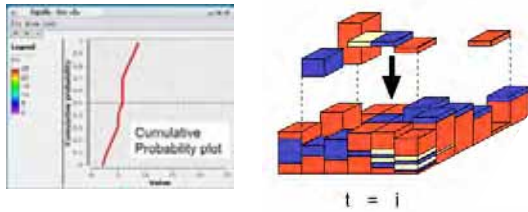


Dynamic modelling in GIS: modelling in three spatial dimensions and error propagation modelling

Derek Karssenberg



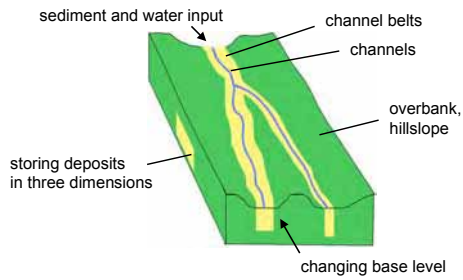
PCRaster research team, Department of Physical Geography, Faculty of Geosciences, Utrecht University

Computer modelling in the earth sciences

- Forward modelling through time: time steps
- Process based modelling: numerical solution of physical equations
- Spatial processes: 2D and 3D spatial domain
- Error propagation through Monte Carlo simulation

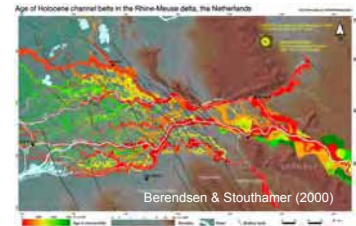
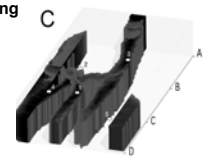
Example model: process-based alluvial architecture modelling

- forward modelling
- processes of erosion and deposition
- channel bifurcation and avulsion



Relevance of alluvial architecture modelling

- predicting oil and water resources
- studying fluvial systems under external forcing (climate change)



Researchers are good in science . . .



$$\left[-K \frac{\partial h}{\partial x} \Big|_{x+M} + K \frac{\partial h}{\partial x} \Big|_x \right] \Delta y \delta + \left[-K \frac{\partial h}{\partial y} \Big|_{y+M} + K \frac{\partial h}{\partial y} \Big|_y \right] \Delta x \delta = -S \Delta x \Delta y \frac{\partial h}{\partial t}$$

Researchers are not programmers

```
#include <time.h>
#include <stdio.h>
#include <stdlib.h>
#include <conio.h>
#include <vga.h>
#include <vga_font.h>

extern unsigned _stklen - 20000;
void main()
{
    char text[100];
    clock_t clk_delta;
    unsigned mode_x[4096], y[4096];
    unsigned i, num_lines, xl, yr, xr, yb;
    float timer;
    printf("input graphics mode (max): ");
    scanf("%x", &mode);
    vga_init(mode);
```

Software engineers are good programmers . .

$$\left[-K \frac{\partial h}{\partial x} \Big|_{x+\Delta x} + K \frac{\partial h}{\partial x} \Big|_x \right] \Delta y \delta t + \left[-K \frac{\partial h}{\partial y} \Big|_{y+\Delta y} + K \frac{\partial h}{\partial y} \Big|_y \right] \Delta x \delta t = -S \Delta x \Delta y \frac{\partial h}{\partial t}$$



```
#include <time.h>
#include <stdio.h>
#include <stdlib.h>
#include <conio.h>
#include <vga.h>
#include <vga_font.h>

extern unsigned _stklen = 20000;
void main()
{
    char text[100];
    clock_t clk, delta;
    unsigned mode, x[4096], y[4096];
    unsigned i, num_lines, xi, yi, xr, yr;
    float timer;
    printf("input graphics mode (hex): ");
    scanf("%x", &mode);
    vga_init(mode);
```



Solution: model construction with building blocks

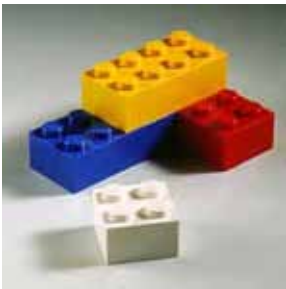
1) Software engineers develop a model construction toolbox:

- building blocks: spatio-temporal functions
- framework to glue together functions
- visualisation routines that read data written by the framework




Solution: model construction with building blocks

2) Researchers construct models with the toolbox

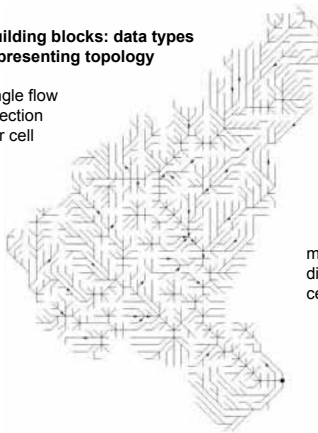


Building blocks: classic functions on raster maps

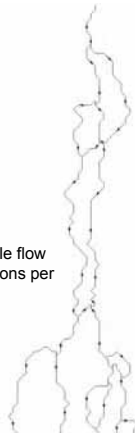
	point functions
	direct neighbourhood functions
	entire neighbourhood functions
	neighbourhood functions with a given topology

Building blocks: data types representing topology

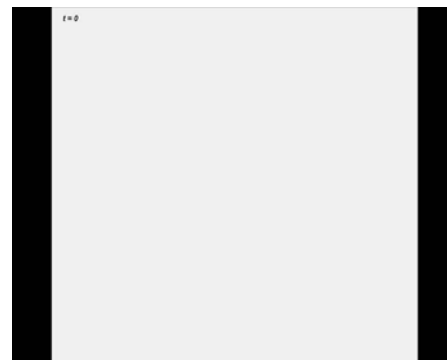
single flow direction per cell



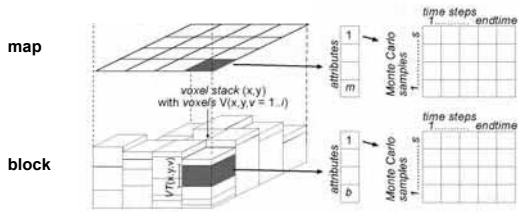
multiple flow directions per cell



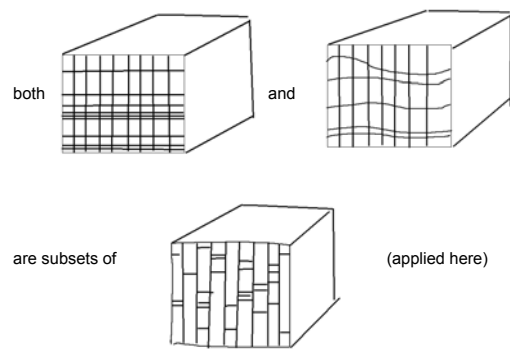
Video dynamic evolution of channels



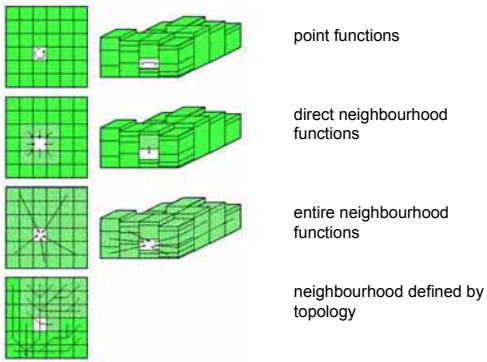
3D building blocks



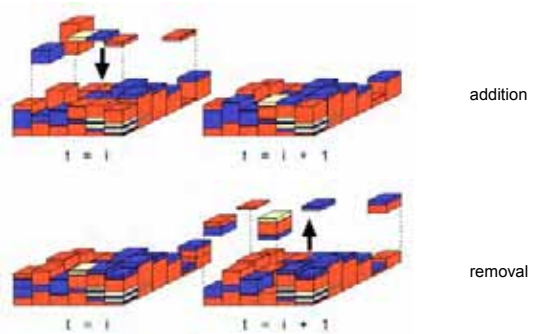
Vertical discretization



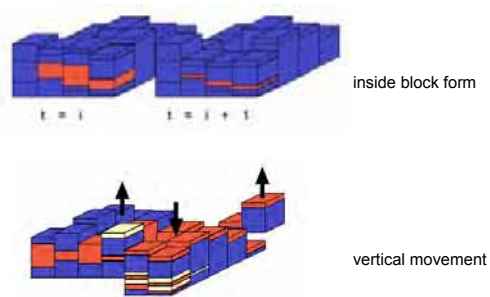
Building blocks: standard functions on maps and blocks



Building blocks: functions on blocks, change of form



Building blocks: functions on blocks, change of form

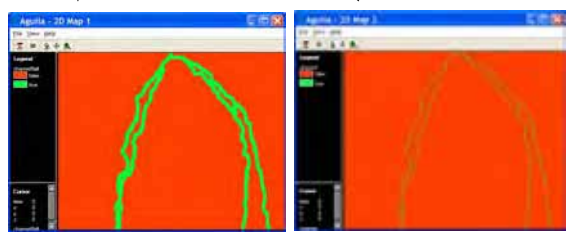


Glueing together the building blocks: functions in a script

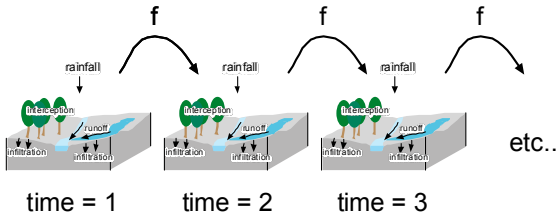
```

...
beltRadius= channelBeltWidth/2
channelBelt = spread(channel,0,1) < beltRadius
...

```



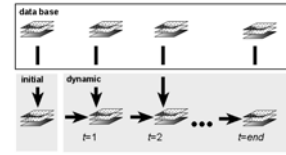
Framework to represent time



Order of calculations:

```
run functions calculating initial state
for t in timesteps:
    run functions representing f
```

Framework: structured script

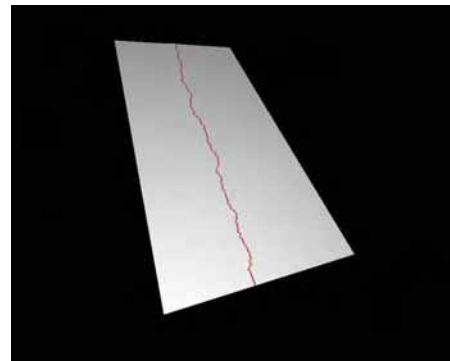
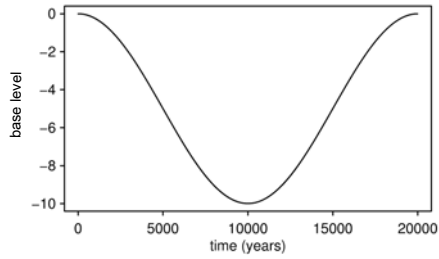


```
initial
# sequence of functions

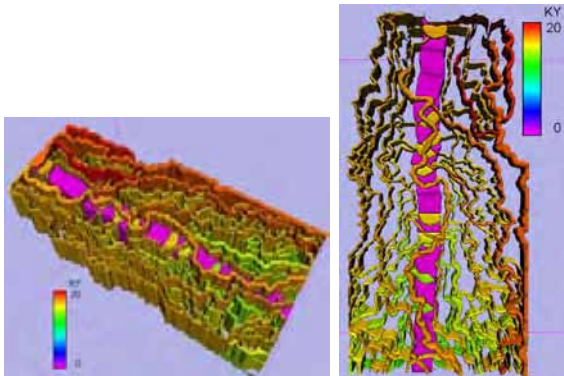
dynamic (nrtimesteps=...)
# sequence of functions
```

Standard run

- parameters and boundary conditions comparable to Rhine-Meuse
- cell size 200 m, modelling area 30 x 60 km
- external forcing: base level change

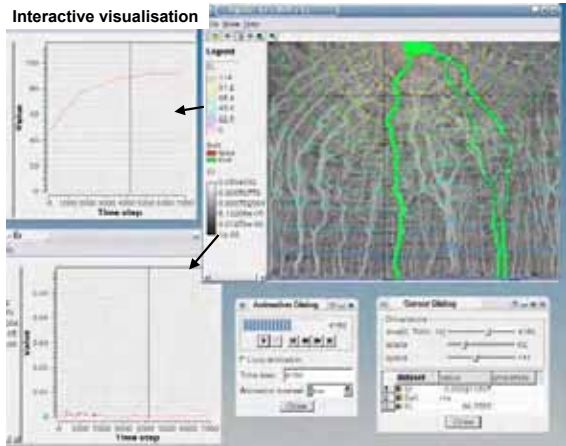


Channel belt distribution



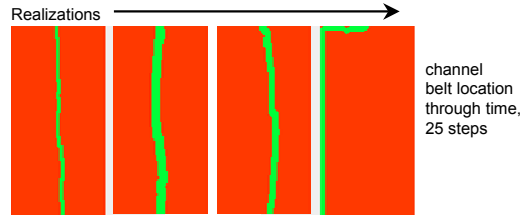
Interactive visualisation

Interactive visualisation



Dealing with stochastic variables: Monte Carlo simulation

- Many models use stochastic variables
- Application of Monte Carlo simulation



Framework Monte Carlo simulation



Representing the stochastic dimension in a script: framework

```

preloop
# sequence of functions

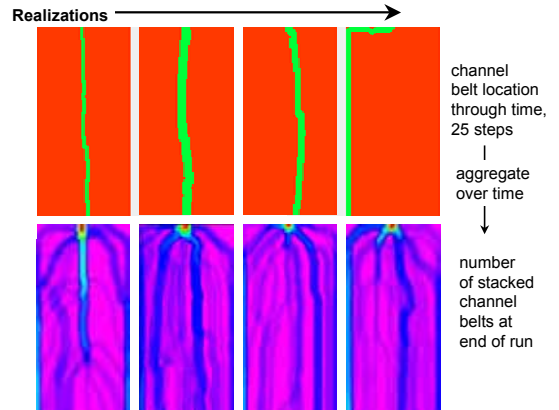
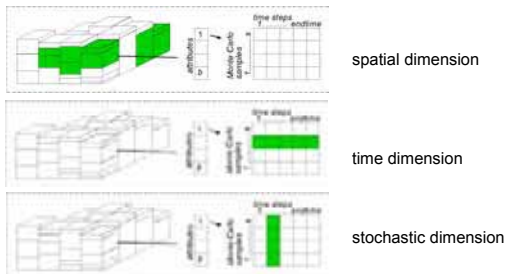
initial (nrloops=...)
# sequence of functions

dynamic (nrtimesteps=...)
# sequence of functions

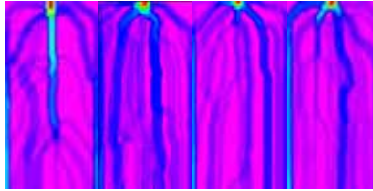
postloop
# sequence of functions
    
```

Functions calculating descriptive statistics

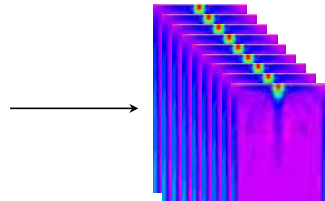
calculate a statistical value of attribute values



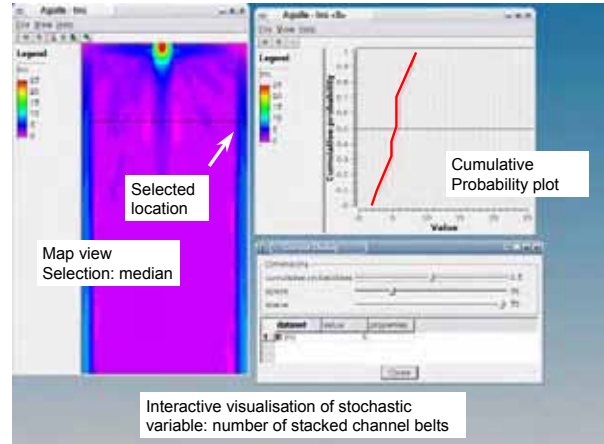
Realizations (number of stacked channel belts)



aggregate over Monte Carlo realizations →



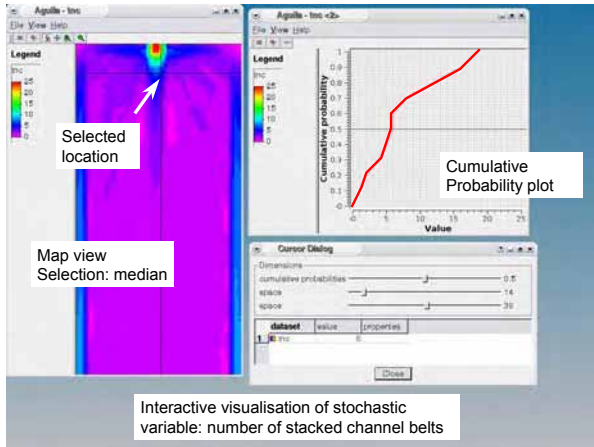
Stochastic variable represented by quantiles (e.g. 0.1, 0.2, ..., 0.9)



Map view Selection: median

Cumulative Probability plot

Interactive visualisation of stochastic variable: number of stacked channel belts



Selected location

Cumulative Probability plot

Map view Selection: median

Interactive visualisation of stochastic variable: number of stacked channel belts

How do we provide these tools to the user?

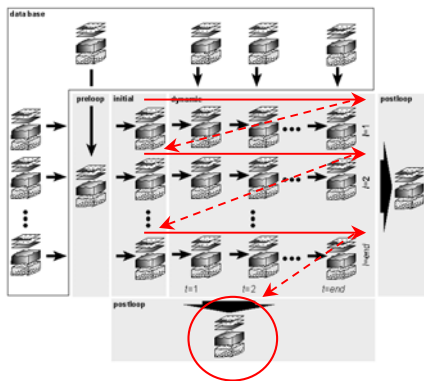
PCRaster PCRcalc

- language completely tailored to modelling in time and space
- very easy to use

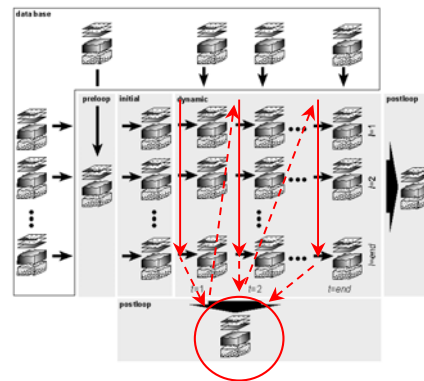
PCRaster Python

- Python: generic scripting language (used in Arc/Info, Google)
- all functionality for spatial temporal modelling is available in Python (Python extension)
- somewhat more difficult to use, but more flexibility

Challenges for the future: order of calculation and I/O



Challenges for the future: order of calculation and I/O



Final remarks, conclusions

- programmers developing blocks and researchers building models by combining these blocks is a very efficient approach in research
- standard tools are available now for 3D modelling and error propagation modelling
- optimization in a language completely tailored to dealing with all dimensions is a challenge for the future

Acknowledgements

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And many other people providing all kinds of support and ideas

Info at: <http://pcraster.geo.uu.nl>