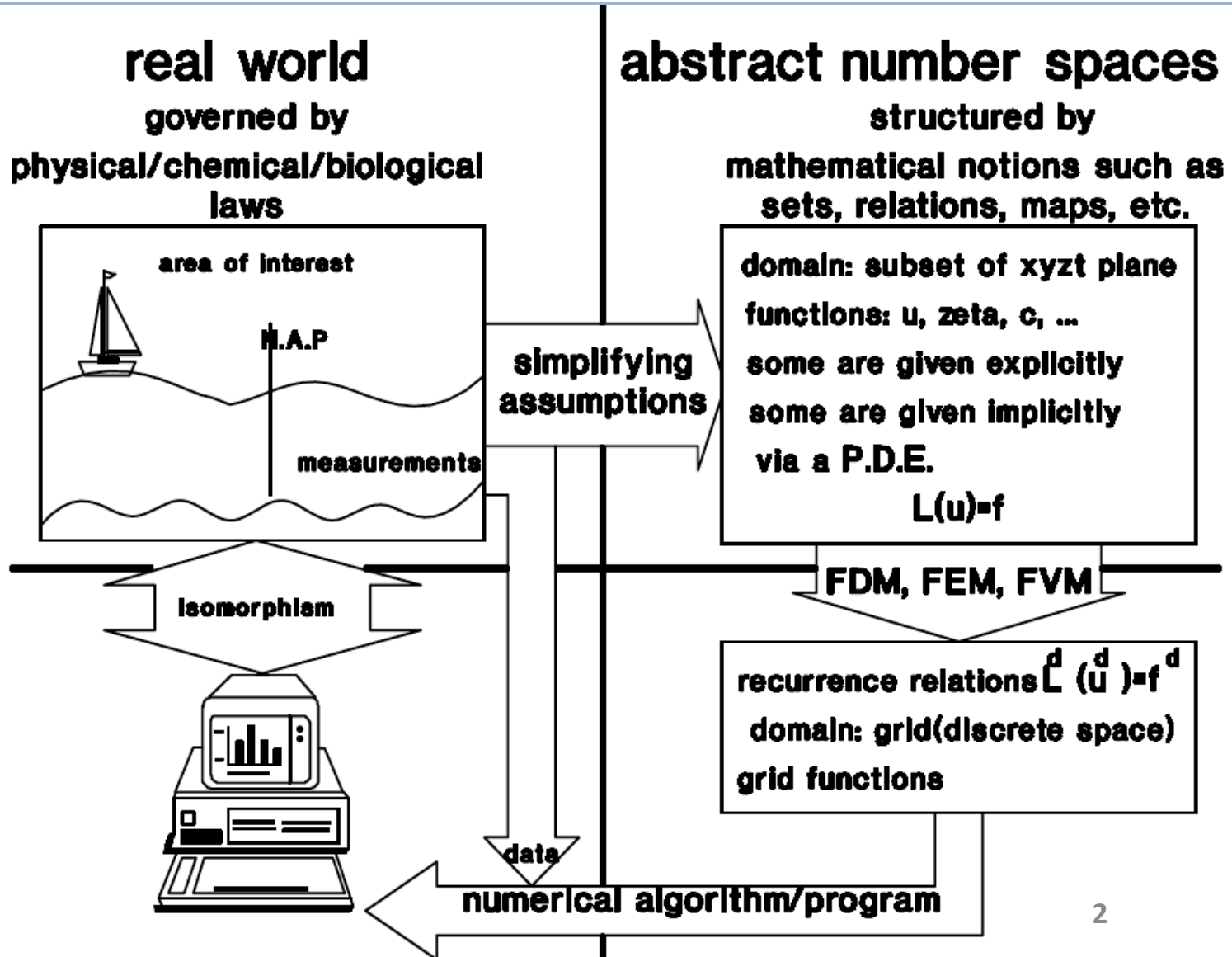


# COMPUTER DETERMINISTIC MODELS

How do we CALCULATE?

# What are we doing in this part?





# Numerical Solutions

# Numerical Solution

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- What do we normally solve? →

Conservation equations, for example:

$$\Delta V = -\frac{\partial Q}{\partial x} \Delta x \Delta t + q_{lat} \Delta x \Delta t \qquad \sum F = \rho \Delta x \frac{\partial A_t u}{\partial t}$$

- What are these equations called?
- What do we need to correctly solve these equations?
  - ▣ A discretization method to approximate the equations with a system of algebraic equations
  - ▣ A solver to solve the system of algebraic equations (direct/iterative)

# Numerical Solvers

- Components

  - ▣ linearized equations

  - ▣ equation solvers

- Practical issues with them:

  - ▣ efficiency

  - ▣ accuracy

  - ▣ stability

  - ▣ robustness

  - ▣ conservation

# Numerical Solutions – Accurate?

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- What do you have to keep in mind?
  - ▣ Numerical results will always be approximate. Where do these approximations come from?
    - Equations (e.g. shallow water, Boussinesq, turbulence etc.)
    - Discretization process
    - Solution method (typically iterative although direct solvers exist)
  - ▣ How do we overcome these approximations?
    - Data for our models
    - More accurate interpolation schemes or smaller regions
    - Have we completed enough iterations
  - ▣ This means → **KNOW** what your **ERROR ESTIMATES** are

# General Issues with Numerical solutions

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## □ Conservation

- ▣ Equations are conservation laws!
- ▣ Schemes should respect these laws.
- ▣ Becomes a constraint on the solution.
- ▣ Typically guaranteed for FV but not for other methods.

## □ Boundedness

- ▣ Solutions should lie within proper bounds.

## □ Realizability

- ▣ Not necessarily a numerical issue
- ▣ Physical model we use should be physically realistic as well

# Mathematical issues with numerical solutions

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- Consistency
  - Truncation error  $\rightarrow 0$  as the time step / grid spacing  $\rightarrow 0$
  - Even if consistent, solution may not become exact when step sizes are small. For this to occur the solution must be stable.
- Stability
  - Scheme is considered stable when errors from solution process are not magnified in the solution process
  - Mostly investigated with linear problems and constant coefficients without boundary conditions using von Neumann method
  - Typically most schemes require some restrictions on time step or grid size (CFL criteria)
- Convergence
  - Discretized solution  $\rightarrow$  exact solution of the differential equation as the grid spacing  $\rightarrow 0$ .
  - Lax equivalence theorem is used for linear initial value problems
  - However for real problems, we usually do a grid-independent study



# Solution Methods (Iterative)

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- Solve matrix from discretized equations
  - Guess solution
  - Improve by following a procedure until convergence criteria is satisfied.
  - Typically split matrices into Lower, Upper, Diagonals
- Basic methods: Jacobi, Gauss-Seidel
- Overrelaxation: SOR, SLOR, Red-black point relaxation
- Other Methods: Stone's, ADI, Multigrid

# Discretization Method

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- Various methods exist to discretize the equations
  - ▣ Finite Difference
  - ▣ Finite Volume
  - ▣ Finite Element (similar to FV in many ways; typically use a triangular element in 2D)
  - ▣ And others:
    - Spectral methods
    - Boundary element
    - Vorticity-based
    - Lattice Boltzmann
    - And many more

# Finite Difference Overview

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- Oldest method
  - ▣ Advantages: Easy to implement
  - ▣ Disadvantages: Restricted to structured grids, doesn't conserve mass without special treatment
- Methodology
  - ▣ Requires a structured mesh  $(i,j,k)$
  - ▣ Discretize domain of interest into grid points
  - ▣ Discretize equations –obtain derivatives from Taylor series expansions
  - ▣ Each grid point has an algebraic equation that must be solved
  - ▣ Solve resulting linear algebraic equations

# Finite Volume Overview

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- Advantages
  - ▣ Mass, momentum and energy are conserved in the formulation
  - ▣ Well developed iterative solvers exist
- Disadvantages
  - ▣ False diffusion depending on numerical scheme
- Methodology:
  - ▣ Solve integral equations (not differential)
  - ▣ Divide domain into CVs, assign computational node to CV centroid
  - ▣ Interpolate to obtain values at surfaces (f of node values)
  - ▣ Approximate surface and volume integrals
  - ▣ Each grid point has an algebraic equation but with neighboring values as well
  - ▣ Solve set of Linear Algebraic Equations

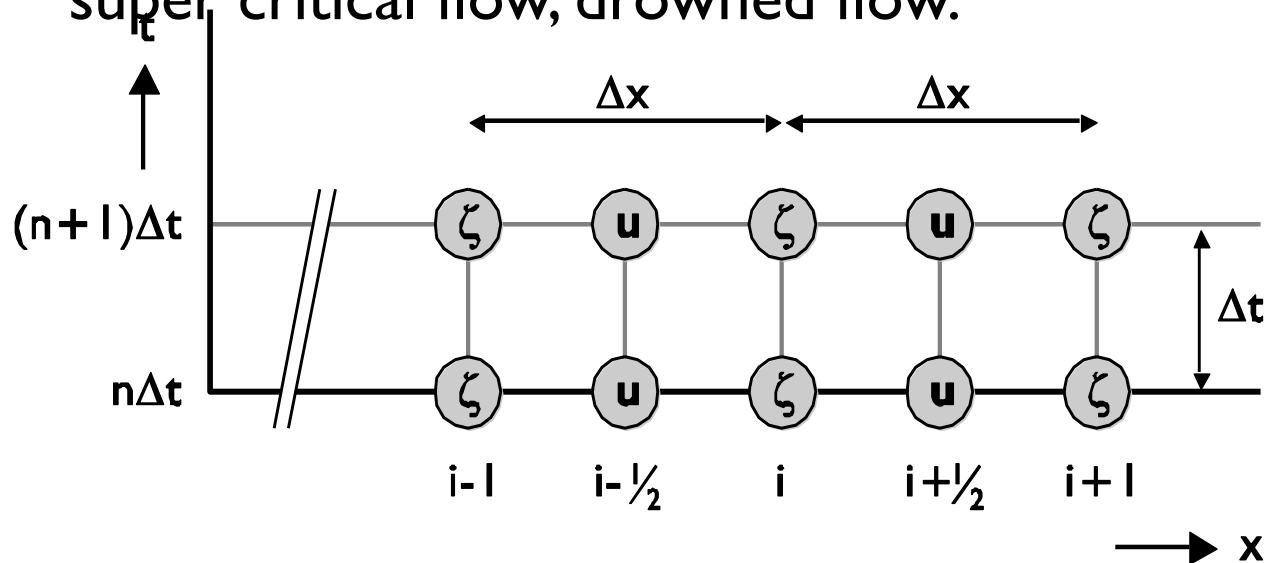
# Finite Element Method

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- More well known in structural analysis
- Developed for fluid flow solution in 1970s
- Similar in approach to Finite Volume but uses weights as multiplier to equations. Results in non-linear algebraic equations
- Advantages
  - ▣ Accurate for coarse grids
  - ▣ Works well for viscous free surface problems
- Disadvantages
  - ▣ Slow for large problems
  - ▣ Weak for solving turbulent flows

# Staggered grid approach

- Water levels are calculated at grid points
- Discharges or velocities are calculated at grid sections
- stable, robust, accurate: can handle dry-bed, sub- and super critical flow, drowned flow.



# When evaluating a numerical modeling solution you should be able to

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- Be aware of the 3 Primary Error Sources
  - ▣ Modeling errors → Difference between actual conditions and the exact mathematical model solution
    - Mainly arises due to assumptions made in deriving equations (Turbulence, Shallow water etc.)
    - Simplification of geometry; boundary conditions etc. (Unfortunately not known a priori, can only be known after comparing to data!)
  - ▣ Discretization Errors → Errors due to differences between exact mathematical solution and that derived from exact solution of discretized equations
    - On a particular grid, methods of the same order may produce differences in solution up to an order of magnitude depending on the discretization method
  - ▣ Iteration / Convergence Errors → Differences between the exact discretized solution and that obtained from an iterative solution method
    - Easiest to control
    - Normally we stop when the difference between successive iterations are less than a pre-selected value (typically normalized)
- Unfortunately sometimes these errors can cancel each other



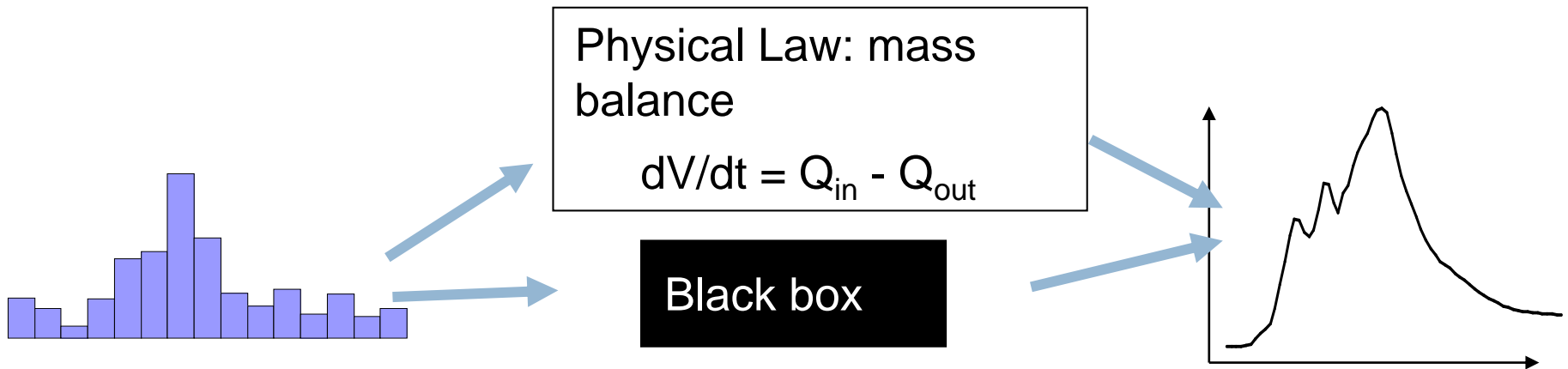
# Modeling Rainfall into Runoff

## Part 1



# Hydrological modeling

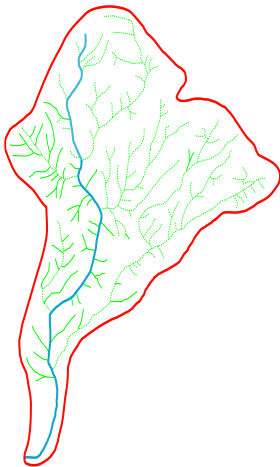
- Often the terminology physically based versus non-physically based is used:
  - ▣ Physically-based models: physical equations are used
  - ▣ Non-physically based: empirical, statistical models (neural networks, unit hydrograph)



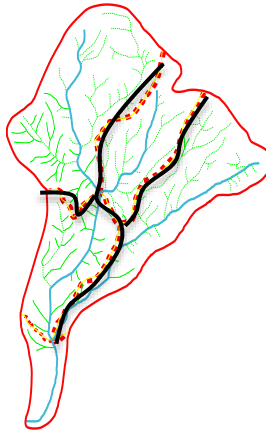
# Hydrological modeling

- 3 kind of models
  - ▣ Lumped models
  - ▣ Semi-distributed models
  - ▣ Distributed models

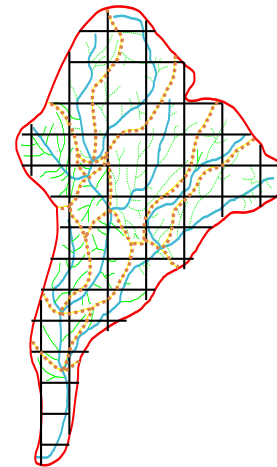
Lumped  
model



Semi-  
distributed  
model



Fully  
Distributed  
model



# What is a distributed physically based model?

- These models consider more than just the mass balance
- Additional effects are taken into account:
  - ▣ Presence of gravity: momentum balance equation
    - Allows for the conservatoin of Mass and Momentum
    - Darcy's law for infiltration is a momentum balance
  - ▣ Topography: needed for calculating the gravity component along the flow direction?
    - Need for putting in surface levels, invert and cross sections of streams/ channels
  - ▣ Diffusive processes
    - Water moving through unsaturated soil (Richards' equation)
    - Water flowing in a river: Saint Venant
  - ▣ Vegetation processes (evapotranspiration)
  - ▣ Energy balance

# Distributed Flow routing in channels

## □ St. Venant equations

### ▣ Continuity equation

$$\frac{\partial Q}{\partial x} + \frac{\partial A}{\partial t} = 0$$

### ▣ Momentum Equation

$$\frac{1}{A} \frac{\partial Q}{\partial t} + \frac{1}{A} \frac{\partial}{\partial x} \left( \frac{Q^2}{A} \right) + g \frac{\partial y}{\partial x} - g(S_o - S_f) = 0$$

Local  
acceleration  
term

Convective  
acceleration  
term

Pressure  
force  
term

Gravity  
force  
term

Friction  
force  
term

Kinematic Wave

Diffusion Wave

Dynamic Wave

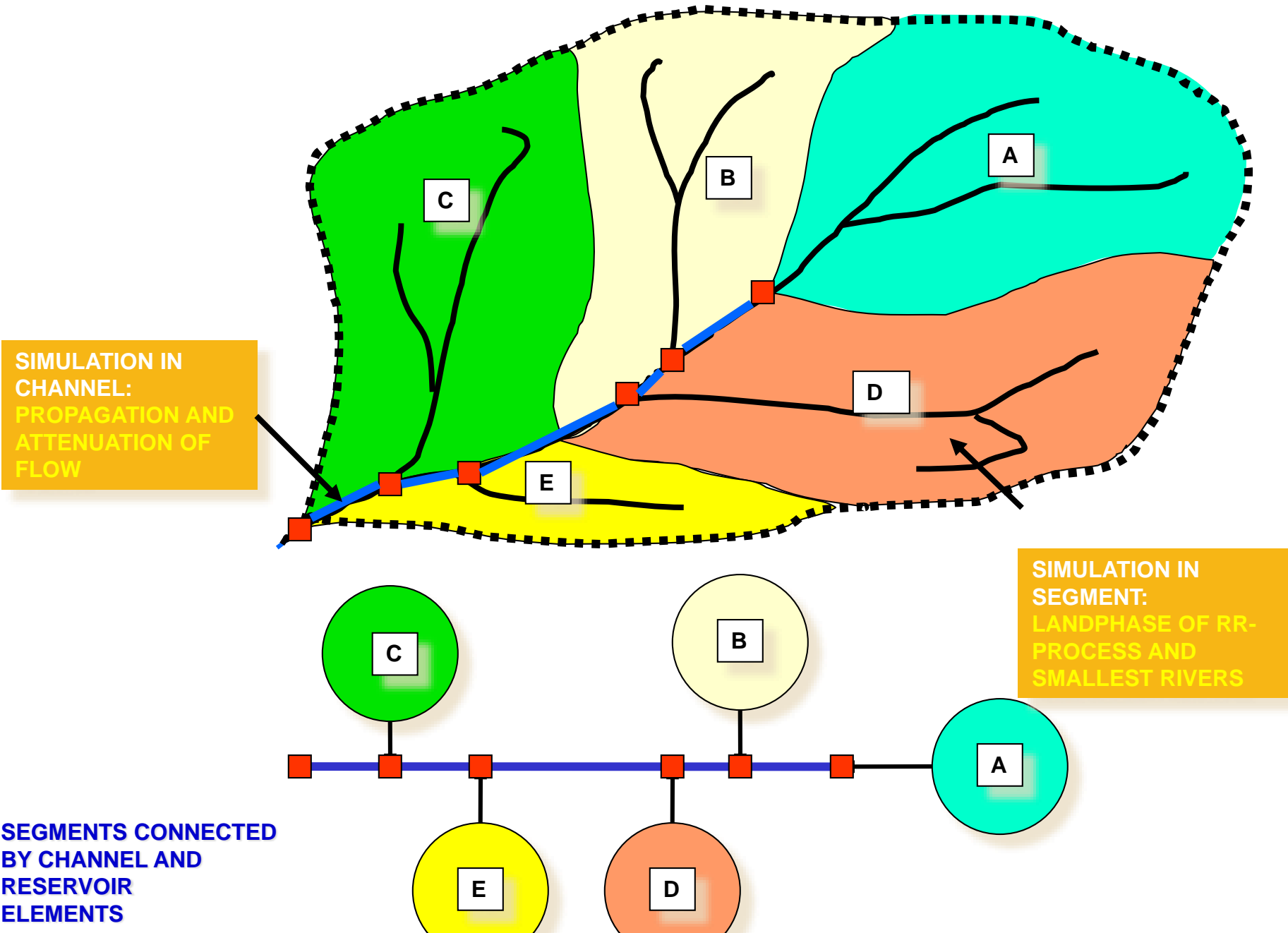
# Pro's and Con's of distributed models

## □ Advantages:

- ▣ physical processes are captured in the best possible manner
- ▣ Future scenarios can be modeled (e.g. climate change) because the model is not calibrated statically

## □ Disadvantages:

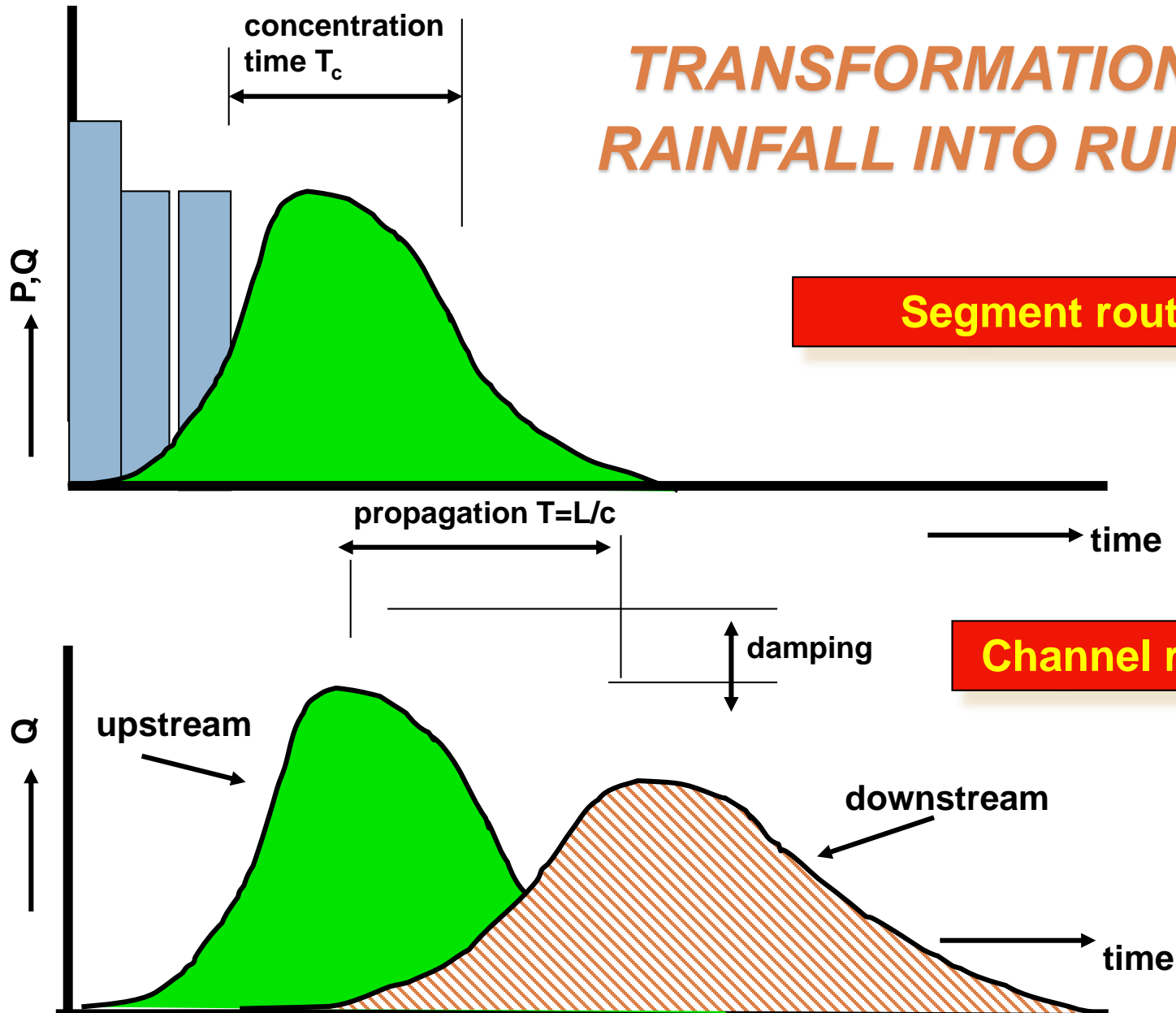
- ▣ Highly detailed information needed
- ▣ Many parameters (soil, vegetation, channel flow etc.)
- ▣ Parameter uncertainty issues (see e.g. GLUE procedure)



# TRANSFORMATION OF RAINFALL INTO RUNOFF

Segment routing

Channel routing





# Modeling Runoff and Routing

## Part 2



# 1D modelling

Physics are always 3D in space and 1D in time, therefore:

The 1D model must be orientated along the river axis

Processes that take place in the two remaining space-dimensions (vertical and transversal) are either **parameterized** or ignored; e.g.

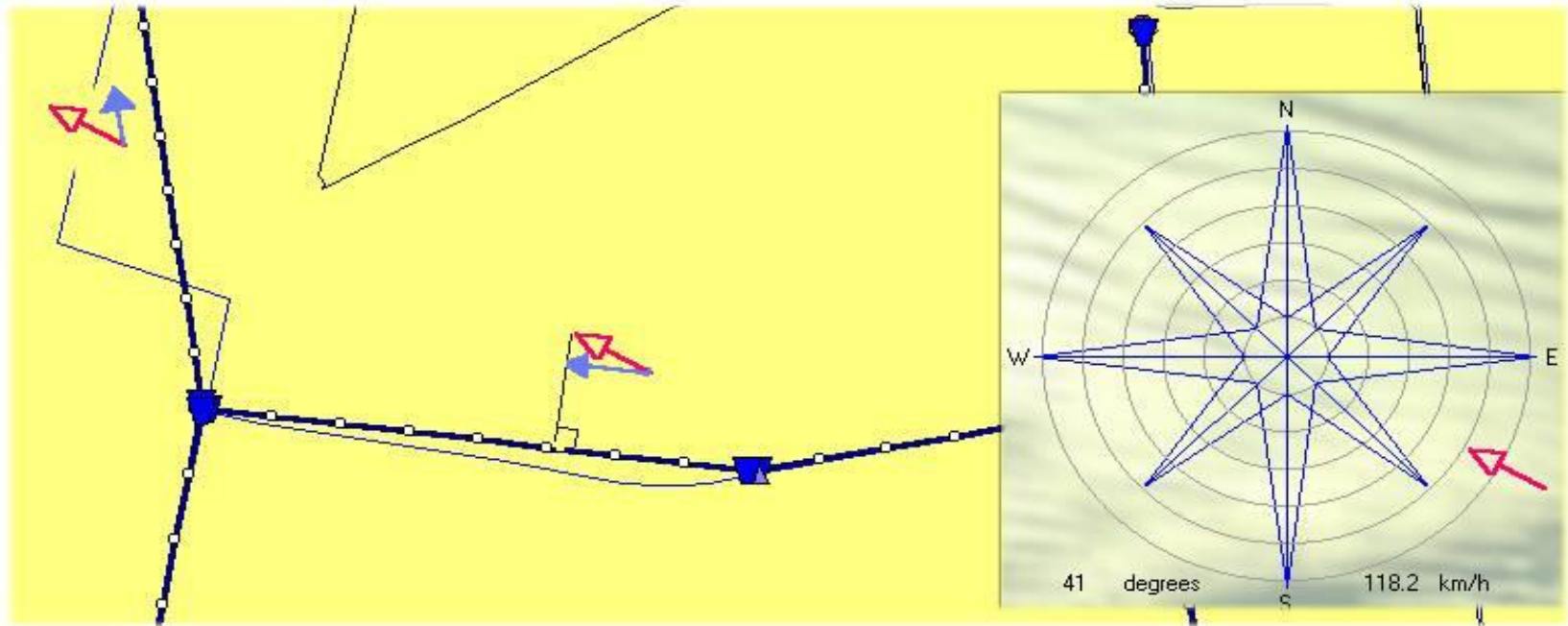


# Other assumptions and simplifications

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- Besides the first one that two- and three-dimensional effects can not be studied
- Hydrostatic pressure
- Velocity perpendicular to the main flow direction is very small
- Cross sections are changing gradually

□ Example 2:



# Quick Aside on the Method of Characteristics

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- Developed in pre-computer days.
- Makes use of the fact that we can use the hyperbolic nature of PDEs to transform PDE into 2 ODEs
- Gives us a way to
  - ▣ Visualize flow disturbances
  - ▣ Help understand numerical procedures required
    - Lets us know the Initial and Boundary conditions required!

# Model (Open) boundaries

- Location of boundaries:
  - model boundaries have to be located at points which are not influenced by system modifications made inside the computational domain
- Boundary data:
  - ONE boundary condition for every characteristic entering the computational domain
- Types of boundaries
  - $Q(t)$
  - $h(t)$
  - $Q(h)$

What to use in a 1D model?

Riverine area (friction dominated flow)

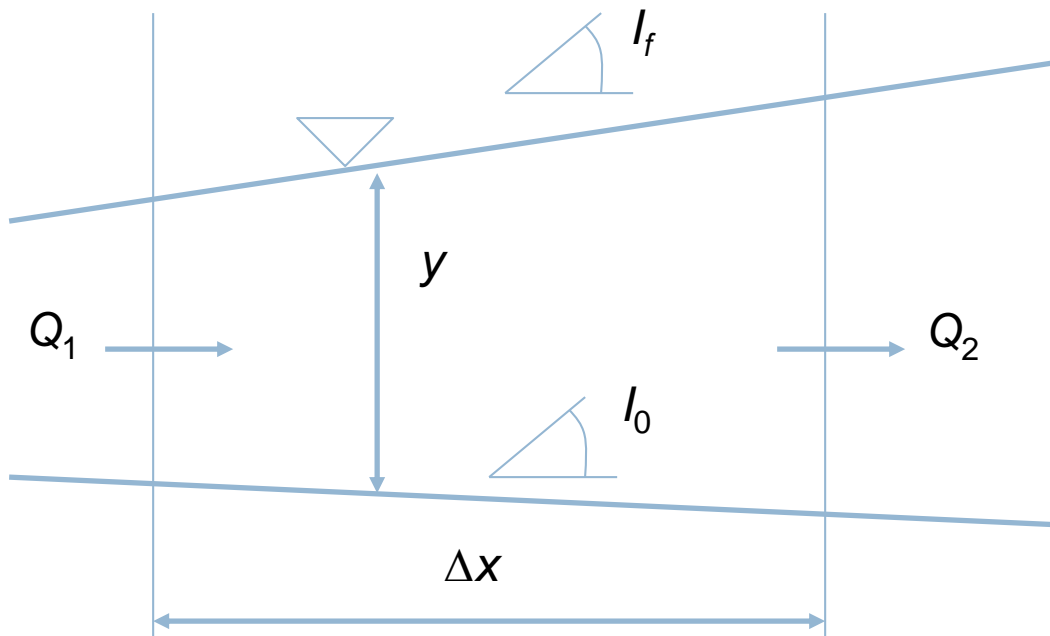
  - Downstream
  - Upstream

Tidal area

  - Downstream
  - Upstream

# What do we solve?

## □ Conservation equations. Of what?



$Q$  = discharge

$y$  = water depth

$I$  = slope

$x$  = length

A longitudinal profile of a channel, between two sections

# Conservation of Mass

Balance of inflow and outflow

$$\Delta V = -\frac{\partial Q}{\partial x} \Delta x \Delta t + q_{lat} \Delta x \Delta t$$



$$\frac{\partial A_t}{\partial t} + \frac{\partial Q}{\partial x} = q_{lat}$$

$$\Delta V = \frac{\partial A_t}{\partial t} \Delta x \Delta t$$

time depending change of water level

# Conservation of Momentum

The second law of Newton:

$$\sum F = m \cdot a$$



$$\sum F = \rho \Delta x \frac{\partial A_t u}{\partial t}$$

Forces: gravity, friction, momentum

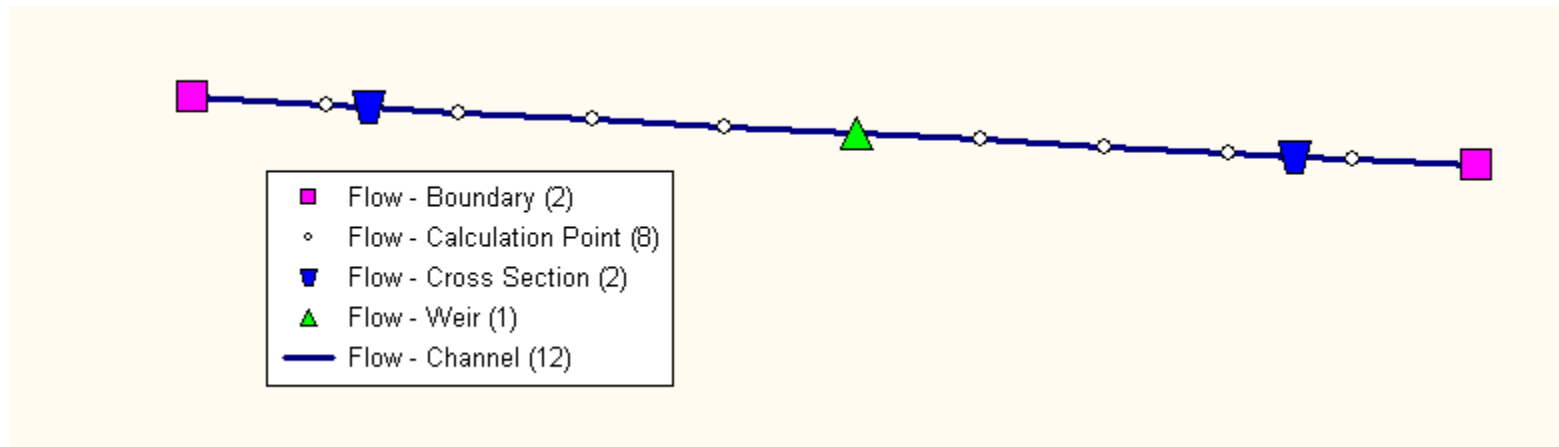
$$F_g = -\rho g A_f \frac{\partial h}{\partial x} \Delta x$$

$$F_b = -\tau l_u \Delta x, \quad (\tau = \rho g r_{hy} I_f)$$

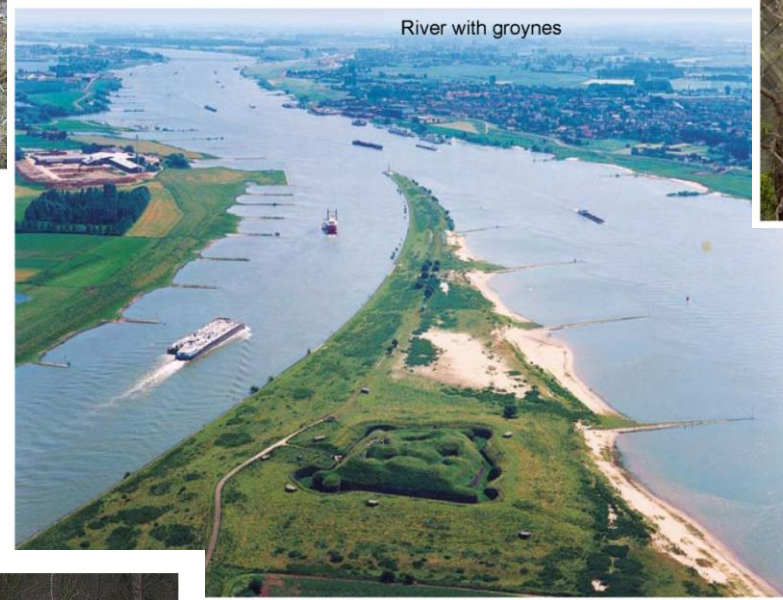
$$F_m = -\rho \frac{\partial A_f u^2}{\partial x} \Delta x$$



# Example of simple 1-D network



# Hydraulic Structures



# Hydraulic structures

- Type of structure (weir, orifice, general structure etc)
- Waterlevel or Energy level based structure equations
- Structure equation parameters based on laboratory results
- Database structure
- Extra resistance (modelling local losses)
- Control of structures (Controllers, Triggers and RTC)

# Structures in the schematisation

- Reach segment containing a structure: hydrodynamic equations are replaced by the discharge formula for the structure:



note:

- The storage on such reach segment is still taken into account
- The structure's crest is never lower than the bed level