

SAMBa

Asymptotic framework for flood models comparison

Piotr Morawiecki, Philippe Trinh Department of Mathematical Sciences, University of Bath Contact: pwm27@bath.ac.uk

You can listen to a **recorded presentation** with an extra multimedia content at: https://people.bath.ac.uk/pwm27/phd.html



Fundamental problems of flood estimation

The fundamental problem of hydrology is to predict river flow given the time series of rainfall data. The state-of-the-art approaches being used include physical, conceptual, and statistical modelling. Despite their overall good performance, it is observed that data-based modelling approaches in some situations give inaccurate predictions, especially in conditions underrepresented in the training data [Keith, 2019]. Understanding the limits of model applicability remains an open challenge.

right answers but also testing whether they get the right answers for the right reasons."

James W. Kirchner (2006)

Physical models are based on Conceptual models are based on laws of fluid dynamics. physical principles, but represented by much simpler mathematical models. + theoretically justified high data and computational + easy and fast to compute power requirements based on unverified assumptions Statistical models use statistical methods (e.g. regression) based on selected catchment parameters. "Chasm of ignorance" + easy to calculate – can give inaccurate predictions, represents the inconsistencies e.g. for small catchments between models assumptions and predictions.

Here we present a unified framework using asymptotic analysis, which highlights differences between these modelling approaches. The framework provides clear analytical and numerical benchmarks on the different approaches in a range of scenarios. Consequently, the proposed approach may lead to better understanding of the uncertainties in hydrologic models, and development of more theoretically-justified flood estimation methods.

How can mathematical modelling and asymptotic analysis help to unify catchment models?

STEP 1. Instead of numerical analysis on specific catchments we consider a **simplified catchment geometry** (e.g. V-shape catchment) reflecting the general properties of real-world systems (Fig 1).

STEP 3. Reduced physical models are analysed using asymptotic methods in order to extract key scaling laws. Our analysis shows different scaling laws are predicted under different models and highlights possible sources of inter-model inaccuracy.

Consider the Boussinesq equation for the groundwater height H on a hillslope:

 $S = \frac{\partial H}{\partial H} - \frac{\partial q}{\partial H} + r$ where $q = K \left(H \frac{\partial H}{\partial H} \cos \theta + H \sin \theta \right)$

Land surface **Fig 1.** Simplified 3D V-shape catchment model Saturated soil (groundwater) Stream Impenetrable layer

STEP 2. Nondimensionalisation of full 3D model allows us to extract key elements responsible for generating flow. The model can be reduced to a 2D model (Fig 2) and in certain scenarios to a coupled set of 1D flow submodels (e.g. representing groundwater and overland flow).

$$S_{y.a.} \frac{\partial t}{\partial t} = \frac{\partial t}{\partial x} + t$$
 where $q = \Lambda_s \left(\Pi \frac{\partial t}{\partial x} \cos \theta + \Pi \sin \theta \right)$

We have showed that in short time asymptotic:

$$Q = q(x = 0, t) = Q_0 + (q_{in} - q_0) \sqrt{\frac{K_s h_r \cos \theta}{\pi S_{y.a.}}} t^{1/2} + O(t)$$

Currently used conceptual models (e.g. [Bell, 2007]) use linear equations for the groundwater flow, with the following short time asymptotic:

$$Q = Q_0 + c(q_{in} - q_0)t + O(t^2)$$

where *c* is a parameter fitted to the data.

The comparison of asymptotic behaviour leads to two important conclusions:

- 1) These models give different scaling at small times $(t^{1/2} vs t)$; the conceptual model does not accurately predict flow in our simplified geometry.
- 2) Asymptotic analysis demonstrates the fitted parameters of conceptual models can be related to physical properties of the catchment ($S_{v,a}$, h_r , θ).

Overland flow given by St Venant equation: $\frac{\partial h_s}{\partial h_s} = -\frac{h_s^{-3}}{h_s} = q_r - f$ Subsurface flow given by the Richards equation: $\partial h_G = \beta^2$ (ang + Fig 2. Reduced 2D catchment cross-section **Key model 2D model dimensionless parameters:** $\beta_x = \frac{L_z}{L} \sim 10^{-3}$ aspect ratio of cross section along hillslope $\tau_s = \frac{L_s}{t_s} \sim 10^{-1}$ ratio of overland and groundwater timescale $q_r = \frac{r}{10} \sim 10^{-1}$ ratio of rainfall and hydraulic conductivity **STEP 4.** The observed inconsistencies in scaling laws may provide information on how to **improve existing flood estimation methods**. Since scaling laws are derived based on simplified geometries,

any model modifications need to be verified on real-world data.

An important result from our work, based on analysis of physical models, is that flow produced by rainfall of typical duration is proportional to the catchment length. In a statistical model currently used by the UK Environmental Agency [Kjeldsen, 2008], it is assumed that flow is dependent on catchment area.

Conclusions and further directions

We clearly demonstrated that underlaying assumption of conceptual and statistical model leads to different catchment behaviour than predicted by benchmark physical models. As a consequence, data-based models may give inaccurate predictions when applied in situations underrepresented in the training data. As demonstrated for a particular statistical model, we can use asymptotic results for physical models to improve currently used methods.

NVA

These are preliminary results of a long-term project, in which we aim to provide hydrologists with new mathematical tools, insights, and more theoretically-justified catchment models. The important milestones of the project are:

- 1. Extracting key dependencies between model variables for the full 2D/3D catchment model.
- 2. Using asymptotic results to develop theoretically-justified computational models for situations not captured accurately by the standard methods.
- 3. Extending benchmark scenarios by including most recent advances in hydrology literature.

We have modified the statistical procedure to use the catchment (river) length instead of area and fitted it to gauged catchments in UK (data source: NRFA). This allowed us to:

- 1) confirm the predictions of physical model,
- 2) slightly improve the model performance,
- 3) significantly improve results of the model diagnostic (e.g. QQ plot).

References:

- Bell, V. A., et al. "Development of a high resolution grid-based river flow model for use with regional climate [Bell, 2007] model output." Hydrology and Earth System Sciences 11.1 (2007): 532-549.
- [Kirchner, 2006] Kirchner, James W. "Getting the right answers for the right reasons: Linking measurements, analyses, and models to advance the science of hydrology." Water Resources Research 42.3 (2006).
- [Keith, 2019] Beven, Keith. "How to make advances in hydrological modelling." *Hydrology Research* 50.6 (2019): 1481-1494.
- [Kjeldsen, 2007] Kjeldsen, Thomas Rodding. "The revitalised FSR/FEH rainfall-runoff method." (2007).
- [Kjeldsen, 2008] Kjeldsen, Thomas R., David A. Jones, and Adrian C. Bayliss. Improving the FEH statistical procedures for flood frequency estimation. Environment Agency, 2008.

