# A The linear feedback precipitation model (LFPM) – a simple and efficient model for orographic precipitation in the context of landform evolution modeling

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**Abstract.** The influence of climate on landform evolution has received great interest over the past decades. While many studies aim at determining erosion rates or parameters of erosion models, feedbacks between tectonics, climate and landform evolution have been discussed, but addressed quantitatively only in a few modeling studies. One of the problems in this field is that coupling a large-scale landform evolution model with a general circulation regional climate model would dramatically increase

- 5 the theoretical and numerical complexity. Only a few simple models are available so far that allow a numerical efficient coupling between topography-controlled precipitation and erosion. This paper fills this gap by introducing a quite simple approach involving two vertically integrated moisture components (vapor and cloud water). The interaction between both components is linear and depends on altitude. This model structure is in principle the simplest approach that is able to predict both orographic precipitation at small scales and a large-scale decrease in precipitation over continental areas without introducing additional
- 10 assumptions. Even in combination with transversal dispersion and height-dependent elevation-dependent evapotranspiration, the model is of linear time complexity and increases the computing effort of efficient large-scale landform evolution models only moderately. Even simple numerical experiments applying such a coupled landform evolution model show the strong impact of spatial precipitation gradients on mountain range geometry including steepness and peak elevation, position of the principal drainage divide, and drainage network properties.

## 15 1 Introduction

The redistribution of moisture from the oceans towards continental domains governs the global erosion engine. Spatial variability in precipitation and hence in the <u>availability</u> availability of water or ice as principal agents of erosion control the shape of <u>individual landforms (e.g. Menking et al., 2013; Chen et al., 2019) or even the the geometry of entire mountain ranges</u> (e.g., Ellis et al., 1999; Willett, 1999; Bonnet, 2009; Goren et al., 2014)landforms (e.g., Ellis et al., 1999; Willett, 1999; Anders et al., 2008)

20 However, feedbacks between topography, precipitation and erosion may even make it difficult to distinguish between cause and effect (Molnar and England, 1990).

Long-term fluvial erosion is a field where simple numerical models have been applied with great success for some decades. The simplest model in this context is often referred to as the stream-power incision model (SPIM) and is the key component of several models of long-term fluvial landform evolution (for an overview, see, e.g., Willgoose, 2005; Wobus et al., 2006). The

25 SPIM considers rivers as linear elements (so without explicitly accounting for the width and the cross-sectional shape) and predicts the erosion rate E as a function of the upstream catchment size A and the channel slope S in the form

$$E = KA^m S^n. (1)$$

While the exponents m and n are assumed to be more or less universal kept constant, all site-specific influences on erosion are subsumed in a single lumped parameter K, called erodibility. The SPIM in its original form (Eq. 1) implements

- 30 the concept of bedrock incision detachment-limited erosion (Howard, 1994) in the sense that all particles once detached from the bedrock are immediately excavated entrained by the river are immediately swept out of the system. The applicability of this concept even to bedrock rivers in high mountain regions has been questioned (e.g., Turowski, 2012). However, considerable progress has been made concerning including sediment transport in the SPIM both theoretically and numerically (Davy and Lague, 2009; Yuan et al., 2019; Hergarten, 2020)several extensions of the SPIM by sediment transport were proposed
- 35 (e.g., Whipple and Tucker, 2002; Davy and Lague, 2009; Hergarten, 2020), where efficient numerical schemes have become available recently (Yuan et al., 2019; Hergarten, 2020). Even extensions towards glacial erosion were recently proposed (Deal and Prasicek, 2021; Hergarten, 2021).

The SPIM and its derivates are well-suited for problems of tectonic geomorphology, e.g., variations variations in uplift rate or contrasts in lithology. In turn, the occurrence of the erodibility as a single, lumped parameter is a serious limitation concerning the influence of precipitation.

40 concerning the influence of precipitation.A framework for extending the SPIM towards a spatial variation in precipitation was already applied in several studies (e.g.,

Yanites and Ehlers, 2012; Goren et al., 2014; Garcia-Castellanos and Jiménez-Munt, 2015; Salles, 2016; Yuan et al., 2019). The idea is that erosion rates should rather depend on discharge than on catchment size, although the SPIM (Eq. 1) is typically written in terms of catchment size for historical reasons. Let P be the effective precipitation for the moment, i.e., the part of the precipitation that contributes to discharge. If we assume that the actual erodibility K refers to a given uniform reference precipitation  $P_0$  and thus to a reference discharge  $q_0 = P_0A$ , the catchment size A can be replaced by  $\frac{q_0}{P_0}$  in Eq. (1). It is then assumed that Eq. (1) holds for any discharge q if A is replaced by  $\frac{q}{P_0}$ . Since the equations become somewhat cumbersome if q is replaced by the integral of P over the upstream catchment, Hergarten (2021) defined

$$A_{\rm eq} = \frac{q}{P_0} \tag{2}$$

50 as the catchment-size equivalent of the discharge. It defines the catchment size needed to generate the actual discharge q at the reference precipitation  $P_0$ . The advantage of using this terminology is that all relations in the context of erosion keep their simplicity, just with  $A_{eq}$  instead of A.

One might think of using scenarios of a general circulation regional climate model for computing precipitation. However, this would not only require a high computing effort, but also introduce several additional degrees of freedom. In sum, e.g., the

- 55 Weather Research and Forecasting (WRF) Model (Skamarock et al., 2021). The recent version of this model can in principle be run on PCs at spatial resolutions of a few kilometers, which allows for a consideration of orographic effects at the catchment scale. However, there would still be a huge imbalance between the complexity of the precipitation model and the simplicity of the erosion model. Preserving this simplicity. This imbalance would not only concern the computing effort, but also the level of detail of the prediction. While we might think of long-term mean precipitation rates in the extension of the SPIM by
- 60 nonuniform precipitation described above, individual large rainstorms and related floods contribute much to landform evolution in reality. So even the question whether an ensemble average or rather some kind of maximum over scenarios of a regional climate model is yields a better input for landform evolution modeling is nontrivial.

Preserving the simplicity of the SPIM and its derivates requires simple models focusing on orographic effects on the relative precipitation  $\frac{P}{P_0}$ , which allows for computing  $A_{eq}$  (Eq. 2). The main challenge is finding a level of complexity that much

- 65 below that of regional climate models that still provides new insights into landform evolutionalthough the model is inevitably oversimplified from the point of view of meteorology. On a qualitative level, reproducing an increased precipitation rate at the windward side of orogens and a rain shadow behind mountains would be some minimum requirement. Taking into account larger scales than the width of individual orogens, it may also be desirable to reproduce the overall decrease in precipitation with increasing distance from the reservoir of moisture (typically an ocean).
- On a fundamental level, even extremely simple approaches were used. Goren et al. (2014) distinguished between the windward side and the leeward side of a mountain belt just by the main drainage divide and assigned an increased relative precipitation to the windward region. This extremely simple model turned out to be sufficient for explaining a shift and an asymmetry in the drainage divide.

In turn, the models proposed by Roe et al. (2003), Smith and Barstad (2004), and Garcia-Castellanos (2007) use the concept of vertically integrated water contents and the respective fluxes per unit width. Assuming steady-state conditions, precipitation is derived from the negative divergence of the flux per unit width. All these models bring the topography into play by a thermodynamic equilibrium that depends on height altitude via temperature.

The earliest among these models (Roe et al., 2003), however, does not model any fluxes explicitly, but directly proposes an equation for the divergence and thus for precipitation. The model predicts the rate of precipitation explicitly as a function

80 of local surface height elevation and slope in wind direction. As the only non-local component of the model, a Gaussian smoothing in upwind direction was used in order to reduce effects of surface roughness. Due to these properties, the model is able to reproduce an increased precipitation at the windward side compared to the leeward side of a mountain belt, but fails to describe the large-scale shadow in a plane behind the mountain range or the decrease in precipitation with increasing distance to the ocean.

The two other models (Smith and Barstad, 2004; Garcia-Castellanos, 2007) consider spatially variable water contents and the respective fluxes, where transport at a given wind velocity is assumed. The model proposed by Smith and Barstad (2004) defines two components, interpreted as cloud water and hydrometeors. This model focuses on condensation and fallout at small scales, while it cannot predict transport over long distances - (see Sect. 6). It therefore requires a refilling from an additional reservoir and is, similarly to the model of Roe et al. (2003), not able to predict large-scale precipitation patterns. In turn, 90 the model of Garcia-Castellanos (2007) describes the vertically integrated water content by a single variable. Using a quite ingenious approach for describing deviations from equilibrium, it is able to capture the increase in precipitation with altitude elevation as well the slow decrease in precipitation with increasing distance from the ocean. In turn, it requires an artificial smoothing at small scales, similarly to the model of Roe et al. (2003).

It seems that the model of Smith and Barstad (2004) (SB model in the following) received the biggest attention in the

- 95 landform evolution modeling community among these models. I was adopted by some other authors in the context of co-evolution of topography and climate (e.g., Anders et al., 2008; Han et al., 2015; Paik and Kim, 2021), although the model of Garcia-Castellanos (2007 some advantages (see Sect. 6). The main advantage of the SB model seems to be that it can be implemented numerically on a regular grid using a forward and backward Fourier transform without the need to carry additional variables and to think about numerical stability and efficiency.
- 100 The goal of this paper study is developing a model that captures both the direct response of precipitation to changes in topography and large-scale precipitation patterns without the need for ad hoc assumptions such as an additional reservoir or smoothing. Beyond this, the numerical complexity should be not much higher than in the existing models. In particular, the linear time complexity (i.e., that the computing effort increases only linearly with the grid size) achieved by contemporary fluvial landform evolution models (Hergarten and Neugebauer, 2001; Braun and Willett, 2013; Yuan et al., 2019; Hergarten, 2020) should be preserved.

105 2020) should be preserved.

## 2 Model description

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The model developed in the following is inspired by the concepts of Smith and Barstad (2004) and Garcia-Castellanos (2007). Similarly to these models, we describe the distribution of water in the atmosphere in terms of vertically integrated water contents measured in <u>mmeters</u>, which can be interpreted as water column heights. Following the ideas of Smith and Barstad (2004), we use two components, while the model of Garcia-Castellanos (2007) uses a single component and thus seems to be

simpler at first sight. However, we will see in Sect. 4.1 that the effort of using two components pays off.

#### 2.1 The governing equations

Let  $u_v$  be the content of vapor and  $u_c$  be the content of cloud water, both vertically integrated and measured as the height of a water column. Following the concepts of Smith and Barstad (2004) and Garcia-Castellanos (2007), we assume that advection with a given velocity is the predominant transport mechanism. If  $v_{v/c}$  is the respective velocity of advection, the advective flux per unit width is

$$q_{\rm v/c} = u_{\rm v/c} v_{\rm v/c}$$
(3)

(measured in square meters per second), where the subscript v/c means that the relation holds for either vapor (v) or cloud water (c). Note that the symbol q was used in Sect. 1 for the discharge of rivers. However, discharges will be expressed in terms

120 of their catchment-size equivalent  $A_{eq}$  (Eq. 2) throughout this paper in the examples (Sect. 8), so that it is not a problem to use  $\frac{q}{q}$  gy/s for the fluxes in the atmosphere in the following.

In a general formulation,  $q_{v/c}$  and  $v_{v/c}$  would be vectors in direction of advection. Let us, for simplicity, assume that the coordinate system is aligned in such a way that advection acts in x-direction. In addition, we assume dispersion in y-direction, i.e., in direction normal to the advection. Then the balance equation for each of the components reads

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$$\frac{\partial u_{v/c}}{\partial t} = -\frac{\partial}{\partial x} q_{v/c} + \frac{\partial}{\partial y} \left( L_{\rm d} v_{v/c} \frac{\partial u_{v/c}}{\partial y} \right) + s_{v/c}, \tag{4}$$

where  $s_{v/c}$  is a source term (measured in meters per second) describing the interaction between the components and the loss by precipitation. The dispersion length  $L_d$  is assumed to be the same for both components, although different values could also be used. Dispersion is the only process that links points with different y values. Without transversal dispersion, the precipitation pattern would fall into a set of individual lines parallel to the x axis. So transversal dispersion is an essential component of

130 the approach in combination with two-dimensional landform evolution models. In turn, longitudinal dispersion could also be included, but we will see in Sect. 3 that it would make the numerical treatment more complicated and in Sect. 4.1 that it is not essential. Therefore, longitudinal dispersion is not taken into account.

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Since the time scales of processes in the atmosphere are much shorter than the time scales involved in landform evolution, steady-state conditions can be assumed in Eq. (4). If we furthermore assume that the velocities are constant, Eq. (4) can be written conveniently in terms of the fluxes per unit width (Eq. 3):

$$-\frac{\partial q_{\rm v/c}}{\partial x} + L_{\rm d} \frac{\partial^2 q_{\rm v/c}}{\partial y^2} + s_{\rm v/c} = 0.$$
<sup>(5)</sup>

Following the concepts of Smith and Barstad (2004), we assume that condensation (from  $u_v$  to  $u_c$ ) and precipitation (from  $u_c$ ) are linear processes with given time constants  $\tau_c$  and  $\tau_f$ , respectively. In contrast to this model and also to the model of Garcia-Castellanos (2007), we do not introduce an equilibrium water content explicitly. Instead, we start from a more fundamental

140 level by considering condensation of vapor and re-evaporation of cloud water (e.g., Roe, 2005) as competing processes in the form

$$s_{\rm v} = -\frac{u_{\rm v} - \alpha u_{\rm c}}{\tau_{\rm c}}.\tag{6}$$

The nondimensional coefficient  $\alpha$  defines the dynamic equilibrium between the two processes. An equilibrium between  $u_c$  and  $u_v$  is achieved if  $\frac{u_v}{u_c} = \alpha$ . Rewriting Eq. (6) in terms of fluxes per width yields

$$145 \quad s_{\rm v} = -\frac{q_{\rm v} - \beta q_{\rm c}}{L_{\rm c}},\tag{7}$$

with the length scale of condensation  $L_{\rm c} = v_{\rm v} \tau_{\rm c}$  and the modified coefficient  $\beta = \frac{v_{\rm v}}{v_{\rm c}} \alpha$  (still nondimensional).

Since the extension of the conversion of vapor into cloud water by a (negative) linear feedback term (evaporation) is the key idea behind our approach, the model is called linear feedback precipitation model (LFPM) in the following.

The rate of precipitation (measured in meters per second) can also be expressed in terms of the flux per unit width according 150 to

$$P = \frac{u_{\rm c}}{\tau_{\rm f}} = \frac{q_{\rm c}}{L_{\rm f}},\tag{8}$$

with the length scale  $L_{\rm f} = v_{\rm c} \tau_{\rm f}$ . Then the source term of  $u_{\rm c}$  is

$$s_{\rm c} = -s_{\rm v} - P = \frac{q_{\rm v} - \beta q_{\rm c}}{L_{\rm c}} - \frac{q_{\rm c}}{L_{\rm f}}.$$
(9)

and the full system of differential equations for the two fluxes reads

scales of condensation  $(L_c)$  and fallout  $(L_f)$  are constant. The Arrhenius relation

$$155 \quad -\frac{\partial q_{\rm v}}{\partial x} + L_{\rm d} \frac{\partial^2 q_{\rm v}}{\partial y^2} - \frac{q_{\rm v} - \beta q_{\rm c}}{L_{\rm c}} = 0$$

$$-\frac{\partial q_{\rm c}}{\partial x} + L_{\rm d} \frac{\partial^2 q_{\rm c}}{\partial y^2} + \frac{q_{\rm v} - \beta q_{\rm c}}{L_{\rm c}} - \frac{q_{\rm c}}{L_{\rm f}} = 0.$$

$$(10)$$

$$(11)$$

#### 2.2 The effect of topography

Orographic precipitation is related to a dependence of the equilibrium on altitude (e.g., Roe, 2005). Since the re-evaporation of cloud water requires energy, altitude has an immediate effect here. The rate of re-evaporation should decrease with decreasing temperature and thus with increasing altitude. As the simplest approach, we consider only this effect and assume that the length

$$\beta \sim e^{-\frac{a}{T}} \tag{12}$$

with a constant a provides the simplest model for the dependence of  $\beta$  on the temperature T, where both a and T are measured in Kelvin. Using a linear decrease of temperature with altitude H,

$$165 \quad T = T_0 - \Gamma H, \tag{13}$$

where  $T_0$  is the temperature at sea level and  $\Gamma$  the lapse rate (measured in Kelvin per meter), Eq. (12) can be written in the form

$$\frac{\beta}{\beta_0} \equiv e^{-\frac{a}{T_0 - \Gamma H} + \frac{a}{T_0}}$$
$$\equiv e^{-\frac{a\Gamma H}{T_0(T_0 - \Gamma H)}}$$
$$\approx e^{-\frac{a\Gamma}{T_0^2}H},$$

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$$\frac{\beta}{\beta_0} = e^{-\frac{a}{T_0 - \Gamma H} + \frac{a}{T_0}} = e^{-\frac{a\Gamma H}{T_0 (T_0 - \Gamma H)}}$$
(14)

where  $\beta$  refers to the altitude H and  $\beta_0$  to sea level. If we assume for simplicity Defining  $H_0 = \frac{T_0^2}{\alpha \Gamma}$ , Eq. (14) can be written in the form

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$$\beta = \beta_0 e^{-\frac{H}{H_0\left(1 - \frac{\Gamma H}{T_0}\right)}}.$$
(15)

For simplicity, we assume that Eq. (1415) also holds for the vertically integrated cloud water content with H as the surface height, we obtain the relation

$$\beta = \beta_0 e^{-\frac{H}{H_0}},$$

where  $H_0 = \frac{T_0^2}{a\Gamma}$  is a lumped parameter. It elevation and neglect the term  $\frac{\Gamma H}{T_0}$ . The latter is a first-order approximation concerning 180 *H*, which requires that the decrease in temperature  $\Gamma H$  is small compared to the absolute temperature  $T_0$  at sea level. Using

$$\beta = \beta_0 e^{-\frac{H}{H_0}}.$$
(16)

This relation describes the decrease of  $\beta$  by a single lumped parameter  $H_0$ , which defines a vertical length scale and describes the height elevation where  $\beta$  has decreased by a factor *e* compared to sea level. While the description of the height-dependence by a single, lumped parameter is convenient, it is not an essential part of our model the LFPM. Any other relation, e.g., the

more elaborate version used by Garcia-Castellanos (2007), which does not rely on the two approximations introduced above, could be used as well.

#### 2.3 Boundary conditions

these approximations, Eq. 15 reduces to

Since the system of differential equations defined by Eqs. (10) and (11) is of first order in x and of second order in y, it 190 is a parabolic system. Finding a unique solution in a rectangular domain ( $0 \le x \le x_{\text{max}}$ ,  $0 \le y \le y_{\text{max}}$ ) requires boundary

conditions at x = 0, y = 0, and  $y = y_{\text{max}}$  (but not at  $x = x_{\text{max}}$ ).

Since moisture is coming in at x = 0, it is straightforward to define  $q_v$  and  $q_c$  there. Then the integral of the total influx  $q = q_v + q_c$  over this boundary defines the total amount of water available for precipitation in the domain. However, the question how to distribute a given total influx q to  $q_v$  and  $q_c$  is not trivial and requires more knowledge about the properties of the model. It will be addressed in Sect. 4.1.

All types of boundary conditions could be used at y = 0, and  $y = y_{max}$ . Neumann boundary conditions or periodic boundary conditions are more useful than Dirichlet boundary conditions here since the  $q_v$  and  $q_c$  are fluxes along these boundaries, and it is not trivial to define reasonable prescribed values for  $q_v$  and  $q_c$ . Homogeneous Neumann boundary conditions define  $\frac{\partial q_{wlc}}{\partial y} = 0$ , which means that there is no transversal dispersion across these boundaries. The implementation in the landform evolution OpenLEM presented in the following section uses periodic boundary conditions in y direction by default, which are convenient in many applications.

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### 3 Numerical implementation

Taking into account advection only along one for the coordinate axis of the coordinate axes and neglecting longitudinal dispersion considerably facilitates the numerical implementation of the model. Let us first rewrite Eqs. (10) and (11) in matrix form

$$-\frac{\partial \boldsymbol{q}}{\partial x} + L_{\rm d} \frac{\partial^2 \boldsymbol{q}}{\partial y^2} - \frac{1}{L_{\rm c}} \mathbf{A} \boldsymbol{q} = 0, \tag{17}$$

where

$$\boldsymbol{q} = \begin{pmatrix} q_{\rm v} \\ q_{\rm c} \end{pmatrix}, \quad \mathbf{A} = \begin{pmatrix} 1 & -\beta \\ -1 & \beta + \phi \end{pmatrix}, \quad \text{and} \quad \phi = \frac{L_{\rm c}}{L_{\rm f}}.$$
(18)

Let us further assume unit grid spacing in both directions,  $\delta x = \delta y = 1$ , for simplicity. This means that the length scales  $L_d$ and L<sub>c</sub> must be measured in terms of the grid spacing in the following. If we use a left-hand (so upwind) difference quotient 210 for the advection term, the discretized form of Eq. (17) can be written in the form

$$-\boldsymbol{q}_{x,y} + L_{d}(\boldsymbol{q}_{x,y-1} - 2\boldsymbol{q}_{x,y} + \boldsymbol{q}_{x,y+1}) - \frac{1}{L_{c}}\mathbf{A}\boldsymbol{q}_{x,y} = -\boldsymbol{q}_{x-1,y},$$
(19)

where the indices x and y correspond to the positions. So the values  $q_{x,.}$  can be computed from the values  $q_{x-1,.}$  by solving a one-dimensional problem (in y direction). The respective linear equation has a tridiagonal structure of  $2 \times 2$  blocks and can be written in the form 215

$$-L_{\mathrm{d}}\boldsymbol{q}_{x,y-1} + \mathbf{D}\boldsymbol{q}_{x,y} - L_{\mathrm{d}}\boldsymbol{q}_{x,y+1} = \boldsymbol{q}_{x-1,y}$$

$$\tag{20}$$

with the  $2 \times 2$ -matrix

$$\mathbf{D} = (1 + 2L_{\rm d})\mathbf{1} + \frac{1}{L_{\rm c}}\mathbf{A}$$
<sup>(21)</sup>

and the  $2 \times 2$  identity matrix 1. This equation system can be solved, e.g., by the direct Gaussian scheme based on  $2 \times 2$  blocks. 220 The examples shown in the following section are computed using the open-source landform evolution model OpenLEM. This model already contains up-to-date implementations of fluvial erosion such as the shared stream-power model (Hergarten, 2020), which will be used in Sect. 8. All components of OpenLEM are of linear time complexity at arbitrary time step lengths, which means that the numerical effort increases only linearly with the size of the lattice. The computation of the precipitation proposed here preserves this property. Independently of the size of the lattice, we found an increase in computing time by a 225 factor of about 2.4 compared to the simplest form of the SPIM and a factor of about 2.2 compared to the shared stream-power model, which includes sediment transport. This increase is owing to taking into account transversal dispersion, where Neumann boundary conditions would be cheaper than the periodic boundary conditions used in OpenLEM.

#### Fundamental properties of the model 4

#### 4.1 Characteristic length scales

230 Let us for the moment consider the model only in longitudinal direction, i.e., without the dispersion term, and let us assume a constant height elevation for the moment. Then the set of parameters consists of two horizontal length scales  $L_c$  and  $L_f$  and a nondimensional parameter  $\beta$ . In this section, it is shown that the relevant length scales that characterize the properties of the model differ from  $L_c$  and  $L_f$ .

In this situation, Eq. (17) reduces to a linear system of two ordinary differential equations,

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$$\frac{\partial q}{\partial x} = -\frac{1}{L_c} \mathbf{A} q.$$
 (22)

The behavior of the solutions are determined by the eigenvalues of the matrix  $\mathbf{A}$  defined in Eq. (18). These are found by solving the characteristic equation of  $\mathbf{A}$ ,

$$\lambda^2 - (1 + \beta + \phi)\lambda + \phi = 0, \tag{23}$$

which yields

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$$\lambda_{\pm} = \frac{1+\beta+\phi}{2} \pm \sqrt{\left(\frac{1+\beta+\phi}{2}\right)^2 - \phi}.$$
(24)

Since  $\beta$  and  $\phi$  are nondimensional, the eigenvalues  $\lambda_{\pm}$  are also nondimensional. The eigenvalues describe exponentially decaying solutions of the form  $e^{-\frac{\lambda_{\pm}}{L_c}x}$ . These solutions can also be written in the form  $e^{-\frac{x}{L_1}}$  and  $e^{-\frac{x}{L_s}}$ , respectively, where

$$L_1 = \frac{L_c}{\lambda_-}$$
 and  $L_s = \frac{L_c}{\lambda_+}$  (25)

245 describe the respective length scales of the decay. Since  $\lambda_{-} \leq 1$  and  $\lambda_{-} \leq \phi$  for all values of  $\beta$  and  $\phi$ ,

$$L_1 > \max\{L_c, L_f\} \tag{26}$$

for  $\beta > 0$ . In turn,  $\lambda_{-}\lambda_{+} = \phi$ , and thus

$$L_1 L_s = L_c L_f. \tag{27}$$

As a consequence,

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$$L_{\rm s} < \min\{L_{\rm c}, L_{\rm f}\}$$
 (28)

for  $\beta > 0$ . So the approach based on the dynamic equilibrium creates two characteristic length scales outside the range between  $L_c$  and  $L_f$ . These scales differ even if we assume  $L_c = L_f$  as suggested by Smith and Barstad (2004).

The longer length scale  $L_1$  describes the ability to transport moisture over large distances. Smith and Barstad (2004) suggested time scales of 200 s to 2000 s for the conversion of cloud water and for fallout, corresponding to length scales  $L_c$  and  $L_f$ of 10 km to 100 km at wind speeds of 50 ms<sup>-1</sup>. If we, e.g., assume  $\beta = 10$ ,  $L_1$  is in the range between 119 km and 1191 km. So the transport range may be considerably larger than the length scales  $L_c$  and  $L_f$  of the involved processes. This property is essential for simulating long-range transport over large continental areas with a closed water balance.

Interestingly, Makarieva et al. (2009) indeed found an exponential decay of mean precipitation rates with increasing distance from the ocean at nonforested areas in a worldwide analysis. They found a decay length of about 600 km, which is 6 to 60



Figure 1. Principal properties of the model in 1D for a boxcar-shaped topography. Fluxes and precipitation rates are shown on logarithmic axes in order to emphasize the exponential decrease.

# 260 times larger than the reasonable range of $L_c$ and $L_f$ , which even refers to quite high wind speeds. This result supports the idea behind the LFPM and provides an idea about the order of magnitude of $L_1$ .

The mode of long-range transport is obtained by inserting  $\lambda_{-}$  into the first row of the eigenvalue equation  $\mathbf{Aq} = \lambda \mathbf{q}$ ,

$$q_{\rm v} - \beta q_{\rm c} = \lambda_- q_{\rm v},\tag{29}$$

and thus

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$$\frac{q_{\rm c}}{q_{\rm v}} = \frac{1-\lambda_-}{\beta} = \frac{1-\frac{L_{\rm c}}{L_{\rm l}}}{\beta} = \frac{1}{\frac{L_{\rm l}}{L_{\rm f}} - 1}.$$
 (30)

According to Eq. (7), this ratio is  $\frac{q_c}{q_v} = \frac{1}{\beta}$  in equilibrium. So the vapor content is slightly above its equilibrium value in the long-range transport mode, which results in a low net rate of condensation.

Figure 1 illustrates the long-range transport for a boxcar-shaped topography with a height H = H<sub>0</sub>. All properties are considered as nondimensional values. The parameter values are L<sub>c</sub> = L<sub>f</sub> = 1, and β<sub>0</sub> = 10. The incoming fluxes are q<sub>v</sub> = 10
and q<sub>c</sub> = 0 at x = 0. According to Eqs. (24) and (26), the length scale of long-range transport is L<sub>1</sub> ≈ 11.9 at sea level (H = 0). Both fluxes and the rate of precipitation decrease exponentially with this length scale for x < 5 and x > 10, except for the beginning of the ranges.

The plateau  $(H = H_0)$  is characterized by a lower value of  $\beta = e^{-1} \approx 0.37$  according to Eq. (7), resulting in a lower length scale  $L_1 \approx 5.5$ . So the precipitation is higher at the plateau, but in turn decreases more rapidly with x. This difference is reflected in a lower ratio  $\frac{q_c}{a_v}$ , so in a lower ability to keep moisture in form of vapor.

In turn, the short length scale  $L_s$  describes the adjustment if the ratio of  $q_c$  and  $q_v$  deviates from Eq. (30). Since these deviations predominantly arise from changes in topography (via the height-dependence elevation-dependence of  $\beta$ ), the length scale  $L_s$  can be considered as the length scale of orographic precipitation.

Three transitions transition zones characterized by  $L_s$  occur in Fig. 1, starting at x = 0, x = 5, and x = 10, respectively. The length scale of the first and the third transition (H = 0) is  $L_s \approx 0.08$ , while it is  $L_s \approx 0.18$  for the second transition  $(H = H_0)$ . In general,  $L_s$  increases with elevation, while the length scale of long-range transport  $L_1$  decreases with elevation. Their product is constant according to Eq. (27).

While the second and the third transition arise from changes in topography, the first transition occurs because it is assumed that the influx only contains vapor ( $q_v = 10$ ), but no cloud water ( $q_c = 0$ ), which is far off from equilibrium and from the longrange transport mode. It is therefore useful to adjust the boundary condition in such a way that the incoming fluxes are in the long-range transport mode described by Eq. (30). Then the incoming flux of cloud water must be

$$q_{\rm c} = q \frac{L_{\rm f}}{L_{\rm l}},\tag{31}$$

where q is the total incoming flux, and  $q_v = q - q_c$ . This modified boundary condition is used in all subsequent examples throughout this study.

290 The non-instantaneous reaction to abrupt changes in topography is a central property of the model. Without this, the small-scale roughness of topography would directly affect the precipitation pattern, so that an additional smoothing procedure would be required. Longitudinal dispersion could also used for smoothing, but as our model the LFPM generates a scale of smoothing on its own, taking into account longitudinal dispersion is not urgently required. Taking this result into account, our approach based on two components of water content with a two-way conversion is some kind of minimum model that is able to capture both continentality (a slow decrease in precipitation at large scales) and a delayed reaction to small-scale changes in topography.

While the model in its original form involves two longitudinal length scales  $L_c$  and  $L_f$ , a transversal length scale  $L_d$ , a vertical length scale  $H_0$ , and a nondimensional parameter  $\beta_0$  (referring to sea level), it is also possible to replace  $\beta_0$  by the length scale of long-range transport  $L_1$  (alternatively also by  $L_s$ , but that would be less useful). The value of  $\beta$  can be computed conveniently from Eq. (23):

$$300 \quad \beta = \frac{\lambda^2 + \phi}{\lambda} - \phi - 1 \tag{32}$$

$$= \left(1 - \frac{L_{\rm c}}{L_{\rm l}}\right) \left(\frac{L_{\rm l}}{L_{\rm f}} - 1\right). \tag{33}$$

While this relation is valid for the respective values of  $L_1$  and  $\beta$  at any heightelevation, it is particularly useful for computing  $\beta_0$  from  $L_c$ ,  $L_f$ , and  $L_1$  at sea level.

If we use  $L_1$  instead of  $\beta_0$ , Eq. (27) reveals that the short length scale  $L_s$  only depends on  $L_1$  and on the product  $L_cL_f$ , while 305 the individual values of  $L_c$  and  $L_f$  are not relevant for  $L_s$  at sea level. This is, however, not the case for the height-dependenceelevation-deper Figure 2 illustrates the relevance of the individual values of  $L_c$  and  $L_f$  in combination with topography. The default scenario (solid blue line) is the same as in Fig. 1, except that the fluxes at the boundary were adjusted according to Eq. (31). In all scenarios,  $L_1$  (at sea level) was kept constant (so not  $\beta_0$ ). As expected, the behavior at sea level remains the same for  $L_c \neq L_f$ (red lines) as long as the product  $L_cL_f$  is constant. This is, however, not true at H > 0, where the increase in precipitation with height-elevation becomes distinctly weaker for  $L_c \neq L_f$  (red vs. blue lines), regardless which of the values is greater.

The decrease in  $L_1$  with <u>height elevation</u> and thus the respective increase in precipitation can be computed from Eq. (1516) according to

$$\frac{dL_1}{dH} = \frac{d\beta}{dH}\frac{dL_1}{d\beta} = \frac{\beta}{H_0}\frac{L_c}{\lambda_-^2}\frac{d\lambda_-}{d\beta}.$$
(34)



Figure 2. Effect of  $L_c$  and  $L_f$ , where  $L_l$  (at sea level) and the product  $L_c L_f$  were kept constant. The solid lines refer to the original scenario (H = 1) and the dashed lines to a reduced topography (H = 0.5). The results for  $L_c = \frac{1}{3}$  and  $L_f = 3$  are practically the same as for  $L_c = 3$  and  $L_f = \frac{1}{3}$ .

The remaining derivative can be computed from Eq. (23),

315 
$$\frac{d\lambda_{-}}{d\beta} = \frac{\lambda_{-}}{2\lambda_{-} - (1 + \beta + \phi)} = -\frac{\lambda_{-}}{\lambda_{+} - \lambda_{-}}.$$
(35)

Inserting this result into Eq. (34) yields

$$\frac{dL_1}{dH} = -\frac{\beta}{H_0} \frac{L_f L_1}{L_1 - L_s} \tag{36}$$

after some basic transformations, and finally after inserting Eq. (1633)

$$\frac{dL_1}{dH} = -\frac{1}{H_0} \frac{(L_1 - L_c)(L_1 - L_f)}{L_1 - L_s}.$$
(37)

320 It is easily recognized that the second factor is always lower than  $L_1$ . So the decrease in  $L_1$  and thus the increase in precipitation with height elevation is always smaller than the decrease in  $\beta$ , which is characterized by the vertical scale  $H_0$ . The relation is symmetric concerning  $L_c$  and  $L_f$ , and the height-dependence elevation-dependence is strongest for  $L_c = L_f = \sqrt{L_1 L_s}$ .

At least for topographies with moderate relief (in relation to  $H_0$ ), a difference between  $L_c$  and  $L_f$  can be replaced by an increased value of  $H_0$ . If we define

325 
$$\tilde{L}_{\rm c} = \tilde{L}_{\rm f} = \sqrt{L_{\rm c}L_{\rm f}}$$
 and  $\tilde{H}_0 = \frac{(L_{\rm l} - \tilde{L}_{\rm c})^2}{(L_{\rm l} - L_{\rm c})(L_{\rm l} - L_{\rm f})}H_0,$  (38)

the behavior of the model essentially remains the same for moderate heightselevations. This result is illustrated by the green lines in Fig. 2. The precipitation obtained for  $L_c = L_f = 1$  with and increased reference height an increased reference elevation  $H_0 = 1.2$  (Eq. 38) are close to those for  $L_c = 3$  and  $L_f = \frac{1}{3}$  with  $H_0 = 1$  for the topography with  $H = \frac{1}{2}$ . For the higher topography with H = 1, however, the remaining deviation is larger.

330

Keeping in mind that the definition of  $H_0$  in Sect. 2.2 already required some approximations, it is not a problem that  $H_0$  has to be increased artificially if we replace different values of  $L_c$  and  $L_f$  by the same value  $\sqrt{L_c L_f}$ . If we accept that there is a

residual overestimation of the effect of topography that increases with surface heightelevation, we can assume  $L_c = L_f$  without losing much of the model's fundamental capabilities.

#### 4.2 The influence of transversal dispersion

335 As mentioned above, transversal dispersion is the only component that prevents the model from falling into a set of independent one-dimensional models. In contrast to the other length scales of the model, however, the dispersion length cannot be interpreted directly as a spatial scale. It rather links longitudinal and transversal length scales of the moisture pattern.

Let us for the moment assume that condensation and fallout are switched off  $(L_c = L_f \rightarrow \infty)$  and that the topography is flat (H = 0). Let us further assume that the incoming flux (at x = 0) has some transversal variation in water content (either in  $q_v$ 340 or  $q_c$  or in both) according to

$$\delta q(0,y) \equiv \propto \sin\left(\frac{\pi y}{L_{\rm y}}\right),\tag{39}$$

where  $L_{y}$  defines the length scale of this variation (half of the wavelength). Then Eq. (10) (or alternatively Eq. 11) yields

$$\delta q(x,y) \underline{=} \underbrace{\propto} \delta q(0,y) e^{-\underline{\tilde{L}}_{x}}, \tag{40}$$

with

345 
$$L_{\rm x} = \frac{L_{\rm y}^2}{\pi^2 L_{\rm d}}.$$
 (41)

So small-scale transversal patterns decay much faster in direction of advection than large-scale patterns. The length scale of the decay,  $L_x$ , decreases quadratically with the scale  $L_y$  of the transversal pattern. The length scale of dispersion,  $L_d$ , describes the strength of dispersion, so that an increase in  $L_d$  reduces  $L_x$ .

350

Figure 3 illustrates the effect of dispersion for an obstacle of a width  $L_y = 1$  and a height H = 1, where the parameter values are the same as in the previous examples. Without transversal dispersion ( $L_d = 0$ ), the higher precipitation falling on the obstacle causes an infinite precipitation shadow. For  $L_d = 0.01$ , the longitudinal scale of decay is  $L_x \approx 10$  (Eq. 41). The precipitation shadow has become considerable weaker at this distance behind the obstacle, but is still visible. Finally, the scale of decay decreases to  $L_x \approx 1$  for  $L_d = 0.1$ , so that the shadow vanishes rapidly behind the obstacle.

#### 5 Extension by evapotranspiration

355 Evaporation including the transpiration by plants, called evapotranspiration, plays a major part in the water balance. While the potential rate of evapotranspiration mainly depends on the climatic conditions and on vegetation, the actual rate is often much lower due to limited availability of water at the surface and in the shallow subsurface.

However, the concept for including variations in precipitation in large-scale landform evolution models is not able to predict the availability of water. The water balance is stated in terms of fluxes, which are not directly related to amounts of stored water. Estimating the amount of stored water would require a model for the flow velocity and would introduce additional



Figure 3. Effect of transversal dispersion on the precipitation precipitation behind an obstacle.

complexity. Garcia-Castellanos (2007) presented a first step in this direction by distinguishing lake areas and assigning a rate of precipitation evaporation to these areas.

Here we propose a simpler idea by assuming that the rate of evapotranspiration is proportional to the rate of precipitation instead of the amount of stored water. This means that a given fraction  $\epsilon$  of the precipitation evaporates immediately. This leads to one additional term in Eq. (10), so that the system of differential equations turns into

$$-\frac{\partial q_{\mathbf{v}}}{\partial x} + L_{\mathbf{d}}\frac{\partial^2 q_{\mathbf{v}}}{\partial y^2} - \frac{q_{\mathbf{v}} - \beta q_{\mathbf{c}}}{L_{\mathbf{c}}} + \epsilon \quad \frac{q_{\mathbf{c}}}{L_{\mathbf{f}}} = 0,$$
(42)

$$-\frac{\partial q_{\rm c}}{\partial x} + L_{\rm d}\frac{\partial^2 q_{\rm c}}{\partial y^2} + \frac{q_{\rm v} - \beta q_{\rm c}}{L_{\rm c}} - \frac{q_{\rm c}}{L_{\rm f}} = \underline{00}.$$
(43)

While the total precipitation is still  $P = \frac{q_c}{L_f}$ , the effective precipitation that contributes to runoff is

$$P_{\rm eff} = (1 - \epsilon)P = (1 - \epsilon)\frac{q_{\rm c}}{L_{\rm f}} \tag{44}$$

370 then.

In order to understand the effect of evapotranspiration, Eqs. (42) and (43) can be brought to the same form as Eqs. (10) and (11) by introducing an increased coefficient for re-evaporation in the atmosphere

$$\tilde{\beta} = \beta + \epsilon \frac{L_{\rm c}}{L_{\rm f}} \tag{45}$$

and an increased fallout length

$$\tilde{L}_{\rm f} = \frac{L_{\rm f}}{1 - \epsilon}.\tag{46}$$

Then  $\phi$  (Eq. 18) changes to

$$\tilde{\phi} = (1 - \epsilon)\phi. \tag{47}$$



Figure 4. Effect of elevation-dependent evaporation on precipitation.

It is easily recognized that  $\tilde{\beta} + \tilde{\phi} = \beta + \phi$ . So only the last term  $\phi$  in Eq. (24) is affected by evapotranspiration. The smaller eigenvalue  $\lambda_{-}$  comes closer to zero then, while the greater eigenvalue  $\lambda_{+}$  does not change much. So  $L_{1}$  increases considerably, while  $L_{s}$  remains almost constant, and thus

$$\tilde{L}_{\rm I} \approx \frac{L_{\rm I}}{1-\epsilon} \tag{48}$$

according to Eq. (27).

380

While these results suggest that the effect of evapotranspiration could be mimicked by modifying the parameters β and L<sub>f</sub> (Eqs. 45 and 46), it must be kept in mind that this only holds at constant elevation. Otherwise, β depends on *H*, and thus also
the effect of ε on L<sub>1</sub>. Since β describes the re-evaporation of water in the atmosphere, it makes sense to assume that the rate of evapotranspiration has the same dependence on *H* as β,

$$\epsilon = \epsilon_0 e^{-\frac{H}{H_0}},\tag{49}$$

although  $\epsilon$  refers to the surface and  $\beta$  to height-integrated vertically integrated properties.

Then the dependence of Eq. (45) remains valid for all heightselevations. However, as  $\epsilon$  decreases with heightelevation, 390 the increase in the effective  $L_f$  (Eq. 46) and thus also in the effective  $L_1$  becomes weaker at large elevations. So mimicking evapotranspiration by adjusting  $\beta$  and  $L_f$  (Eqs. 45 and 46) would overestimate the effect of evaporation at large elevations or, in turn, underestimate the effect of elevation. Figure 4 illustrates this result for the example from Fig. 1, where an evaporation ratio  $\epsilon_0 = 0.5$  is assumed at sea level. The results are compared to the model without evaporation, but with modified parameter values  $\tilde{\beta} = 10.5$  (Eq. 45) and  $\tilde{L}_f = 2$  (Eq. 46). The effective precipitation in the mountain region and the effective length scale

of transport differ by almost a factor of two for  $H = H_0$ . So mimicking evapotranspiration by adjusted parameters is only useful for small topography.

#### 6 Comparison to existing models

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As discussed in Sect. 1, the models of Smith and Barstad (2004) (<u>SB model</u>) and Garcia-Castellanos (2007) also use vertically integrated water contents and advective transport at a given wind velocity. In its spirit, our approach the LFPM is somewhat similar to these models.

It may seem first that taking into account transversal dispersion was the major progress of our approach. However, the numerical scheme proposed in Sect. 3 could in principle also be used for including transversal dispersion in the two other models. The fundamental differences are hidden in details of the model structure that have a bigger effect than it seems first.

The model of Smith and Barstad (2004) SB model assumes only a one-way coupling between the two moisture components. 405 In the terminology of our modelour terminology, this would be  $\beta = 0$  in Eqs. (10) and (11). Following the considerations of Sect. 4.1, the length scale of long-range transport of moisture is  $L_1 = \max\{L_c, L_f\}$  then, which is between about 10 km and 100 km at rather high wind speeds of 50 ms<sup>-1</sup>. So assuming a one-way conversion practically removes the ability to transport moisture over large distances of several hundred km. Smith and Barstad (2004) fixed this problem by assuming kilometers. Therefore, the SB model requires a permanent refilling of the water storages at some given background rate. When considering

410 a large plain, the precipitation rate will always approach this prescribed background rate, regardless of the topography in front of the plain. So this model focuses on the behavior at intermediate scales, but cannot capture large-scale precipitation patterns. This is presumably the reason why the two moisture components are interpreted as cloud water and hydrometeors by Smith and Barstad (2004) in the SB model instead of vapor and cloud water in our model the LFPM.

Beyond this, it must also be noted that the feedback parameter  $\beta$  carries the information about the height-dependence

- 415 in our modelelevation-dependence in the LFPM. So the effect of topography must be included in another way if this feedback is not taken into account. Smith and Barstad (2004) assumed that the rate of conversion is not proportional to the absolute value of the cloud water content ( $q_v$  in our model $u_v$  in the LFPM), but to the difference of this content towards a height-dependent elevation-dependent equilibrium content. This results in an additional source or sink term in the equations, which may even cause negative precipitation rates at the leeward side of a mountain. In order to overcome this problem,
- 420 Smith and Barstad (2004) suggested to truncate the precipitation term explicitly at negative values. Without this truncation, this model would even be linear not only concerning the water contents (like our model), but also concerning the surface height *H*. The truncation, however, even destroys the linearity carries all information about the topography.

In the earliest version of the SB model (Smith, 2003), it was assumed that the source term is directly proportional to the topographic slope in flow direction,  $\frac{\partial H}{\partial x}$ . So upslope flow introduces a positive source term, which is converted into precipitation

425 with some lag and smoothing. Smith and Barstad (2004) proposed a more elaborate source term taking into account airflow dynamics in more detail.

In the following, we compare the two versions of the SB model to the LFPM in a one-dimensional example that describes the rise to a plateau. In contrast to the similar example as considered by Smith and Barstad (2004, Sect. 3c), we do not use a smooth arctangent function, but a ramp with a constant slope between two horizontal planes for clarity. Four different topographies

430 are considered in Fig. 5, where nondimensional coordinates are used. Similarly to Fig. 1,  $L_c = L_f$  is used as the horizontal



Figure 5. Comparison of the LFPM to the simple upslope version of the SB model and the version with advanced airflow dynamics in the hydrostatic limit.

length scale, while  $H_0$  defines the vertical length scale. The four scenarios refer to plateau elevations of  $H = H_0$  and  $H = 4H_0$ and to ramp lengths of  $2.5L_c$  and  $10L_c$ . All precipitation values are arbitrarily scaled, but by constant factors for each model throughout all scenarios. So the absolute precipitation values cannot be compared among the SB model and the LFPM, but among different scenarios for the same model. The background rate was zero in all results of the SB model, so that the values

435 shown in Fig. 5 should not be interpreted as absolute values, but as differences towards a prescribed background precipitation rate for the SB model.

The upslope version of the SB model shows the simplest behavior. The precipitation rate is zero (or equal to the prescribed background rate) in front of the ramp as well as at the plateau far behind the ramp. Since the ramp introduces a constant source term, a constant precipitation rate is also approached at the ramp if the ramp is sufficiently long (Fig. 5b,d). Otherwise, the

440 increase in precipitation ceases at the end of the ramp before a constant rate is approached, which results in a distinct maximum in precipitation at the transition to the plateau.

For the version of the SB model with the more elaborate airflow dynamics, the hydrostatic limit was considered. This model version involves one additional nondimensional parameter  $\hat{H}$  (Smith and Barstad, 2004, Sect. 3b), where we use  $\hat{H} = 1$  suggested as typical value there. Since the simple upslope version corresponds to  $\hat{H} = 0$ , the effect of values  $\hat{H} \neq 1$  could be

- 445 estimated qualitatively from the curves. The most important effect of the more elaborate airflow dynamics is that the source term no longer depends only on the local slope at the considered location, but also on the slopes in a larger part of the domain. As a consequence, the precipitation at a given point does not only depend on the topography in the upwind range, but to some extent also on the topography of the downwind region. This becomes obvious at the plain in front of the ramp, where the precipitation rate already increases at a considerable distance to the ramp. Next, the peak in precipitation is shifted upwind,
- 450

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rate will be lower than the background rate. Overall, the more elaborate airflow dynamics increases the spatial range over which the topography affects precipitation

so towards lower elevations at the ramp. Finally, the values become negative at the plateau, which means that the precipitation

compared to the simple upslope version of the SB model. However, the precipitation approaches the same value (the background rate) in both directions far away from the ramp for all versions of the SB model, independent of the elevation of the plateau.
455 So none of the versions of the SB model can predict precipitation rates at a high plateau that are much lower than those in the

plain in front of the plateau, as it occurs, e.g., in the Tibetan Plateau.

The results obtained from the LFPM are readily understood from the considerations made in the previous sections, where the depletion of moisture by precipitation is the most important phenomenon. If the plateau is low (Fig. 5a,b), the increase in precipitation is moderate. Since the depletion is also moderate then, the plateau is still exposed to considerable precipitation.

460 In turn, precipitation decreases rapidly along the high plateau. The amount of moisture that enters the plateau depends on the length of the ramp, while the further depletion along the plateau is related to the reduced value of  $\beta$  at large elevations. For the long and high ramp (Fig. 5d), the depletion at the ramp is so strong that the entire plateau is quite dry.

Restricted to the region close to the ramp, however, the LFPM and the SB model can be adjusted to yield similar results, although for different reasons. In the LFPM, it is the combination of the elevation-dependent conversion process and the limited amount of moisture, while much of the behavior depends on the model used for the source term in the SB model.

The linearity of the SB model also deserves attention in this context. While both models are linear with regard to the water contents, which costs much of the model's simplicity, in particular if an extension by transversal dispersion is desired. In contrast, Eqs. (10) and (11)of our model are homogeneous, i. e. the SB model is also linear concerning the topography. As a consequence, precipitation patterns for the low and high ramps in Fig. 5 (a/c and b/d) are the same, where only the absolute

- 470 values scale like the elevation of the plateau. Owing to the linearity, precipitation patterns depend only on the lateral structure of the topography, but not on the absolute elevation in all versions of the SB model. While this can be fixed to some extent by adjusting the model parameters for individual scenarios, it becomes a serious limitation in the context of co-evolution of topography and climate, e.g., if the same uplift pattern is considered at different absolute rates. As it will be shown in Sect. 8, the LFPM is more powerful here.
- The linearity of the SB model also affects the precipitation at the leeward side of mountains. The precipitation of a declining ramp would just be opposite to that of an increasing ramp. So if we added a declining ramp behind a large plateau in Fig. 5,

the precipitation rates would be negative there. Taking into account that a background rate has to be added to the precipitation rates shown in Fig. 5, this might not be a crucial problem in some of the scenarios, but in particular for short and high ramps (Fig. 5c), contain no external source or sink terms. As long as  $\beta \ge 0$ , the negative rates would be too high to be compensated by

- 480
- the background rate. In order to overcome this problem, Smith and Barstad (2004) suggested to truncate the precipitation term explicitly at negative values. However, the SB model still predicts extremely dry leeward sides, and improving this behavior was obviously one of the motivations for extending the model by multiple layers proposed by Barstad and Schüller (2011). In contrast, the LFPM does not tend towards extremely dry leeward regions, and it is guaranteed that neither  $q_v$  nor  $q_c$  can become negative. So our model the LFPM requires no artificial measures at the leeward side, in particular no truncation in order to 485 avoid negative precipitation rates.

In this sense, including the feedback by re-evaporation in our approach the LFPM may look more complicated first, but it is the key to capturing large-scale precipitation patterns and avoids the need for taking additional measures against negative precipitation rates at the leeward side of mountains.

The model of Garcia-Castellanos (2007) uses a single moisture component and thus seems to be simpler than our approach. 490 The fundamental structure of this model can be explained by considering the limit  $L_c \rightarrow 0$ . This means that the contents of vapor and cloud water immediately achieve an equilibrium  $\frac{q_v}{a_c} = \beta$ , defined by the height-dependent elevation-dependent value  $\beta$ . Adding Eqs. (10) and (11) then yields

$$-\frac{\partial q}{\partial x} + L_{\rm d}\frac{\partial^2 q}{\partial y^2} - \frac{q}{(1+\beta)L_{\rm f}} = 0,\tag{50}$$

where  $q = q_v + q_c$  is the total flux per unit width. This is the fundamental structure of the model of Garcia-Castellanos (2007) 495 except for the dispersion term. The precipitation rate is the ratio of q and a height-dependent an elevation-dependent value (1 + 1) $\beta L_f$ . The length scale of transport is  $L_1 = (1 + \beta)L_f$  then, which is much larger than  $L_f$  if  $\beta$  is sufficiently large. So replacing the coupling between the two flux components by an equilibrium preserves the ability to capture large-scale precipitation dynamics.

However, the short length scale  $L_s$  is lost if we assume instantaneous equilibrium. Precipitation reacts immediately to changes in topography then, so that the precipitation pattern becomes sensitive to the small-scale roughness. In order to 500 overcome this problem, Garcia-Castellanos (2007) introduced an additional smoothing by applying a convolution with half of a Gaussian curve in upwind direction. As illustrated in Fig. 56, the behavior of the one-component version with additional smoothing is indeed similar to our two-component approach in 1D. Here, a smoothing length  $\Delta x = 2L_s$  appears to be a reasonable choice at H = 0. However, it should be emphasized that the concept of smoothing including the choice of a smoothing

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In this sense, considering two moisture components is indeed the simplest choice if we want to combine long-range transport and a smooth response to sharp topographic gradients in a linear model. This result is directly related to the occurrence of two

length is an ad-hoc assumption, while smoothing automatically emerges in our two-component model the LFPM. Beyond this, applying the convolution with half of a Gaussian function is numerically more expensive than the treatment of two moisture components.



Figure 6. Comparison of our approach the LFPM to the one-component model of Garcia-Castellanos (2007). The parameter values are the same as in Fig. 1.

510 eigenvalues, i.e., horizontal length scales discussed in Sect. 4.1. A single-component model seems to be simpler at first sight, but we have to pay for this simplicity later as soon as we need the second length scale.

Moreover, the model of Garcia-Castellanos (2007) contains a nonlinear component, which is not included in our approach the LFPM. While the precipitation term  $\frac{q}{(1+\beta)L_f}$  in Eq. (50) was obtained by simplifying out two-component model, Garcia-Castellanos (2007) introduced an expression with this structure directly in the form

515 
$$P = P_0 \frac{u}{u_{\max}(H)},$$
(51)

where  $P_0$  is some reference precipitation,  $u_{\max}(H)$  is a height-dependent elevation-dependent maximum water content. While this expression is still equivalent to the precipitation term in Eq. (50), it was extended in such a way that Eq. (51) is only applied for  $u < u_{\max}(H)$ . Otherwise, it was assumed that the excess water content  $u - u_{\max}(H)$  is immediately converted into precipitation. Transferred to the formalism of Eq. (50), this occurs if the ratio  $\frac{q}{1+\beta}$  exceeds a given threshold.

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The green red curve in Fig. 5-6 illustrates this effect, where it was assumed that the air at the left-hand boundary is just at the limit  $u = u_{\max}(0)$ . While  $u < u_{\max}(0)$  in the foreland,  $u_{\max}(H)$  (via  $1 + \beta$  in our formalism) decreases suddenly at x = 5 due to the sudden increase in H, so that  $u > u_{max}(H)$ . This would even result in a sharp peak in the precipitation curve without smoothing. Smoothing in upstream direction reduces the height of the peak and widens it into the plateau.

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As a main effect of this extension, the model of Garcia-Castellanos (2007) becomes able to predict some kind of overshooting in precipitation at the windward side of mountains. For a high-altitude high plateau, the original version predicts a gentle increase of in precipitation to the level at the plateau. A decrease in precipitation only occurs due to the decrease in water content or, if we consider a mountain range, due to decreasing height elevation at the leeward side.

Such an effect might be useful, although the physical basis is not trivial since a dynamic equilibrium between vapor and cloud water is already included in the linear model. Our linear two-component model could be extended by nonlinearity in several ways. The precipitation process may be a candidate here since coagulation plays a part in the growth of hydrometeors, 530

and the rate of coagulation increases rather quadratically than linearly with concentration. However, following the concept of parsimony, we do not follow ideas of nonlinearity further in this study.

## 7 Examples A real-world example

to north-east) starts from a point in the ocean.

This section presents an application of the LFPM to a real topography. It should, however, rather be seen as an illustration than as a validation. While the attempt to validate the SB model by Barstad and Smith (2005) suffered from the availability of data at a sufficient spatial resolution, we must keep in mind that all models discussed in this paper were not tailored for reproducing precipitation patterns exactly. As discussed in Sect. 6, predicting the effects of changes in topography on precipitation is more important and more challenging in the context of landform evolution than, e.g., adjusting a model to predict the precipitation rate at the front of a mountain range close to the coast. Thus, a serious validation would have to be based on several locations

540 and scenarios, where the LFPM and other models would have to be tested against real-world data and regional climate models.

Figure 7 compares the precipitation pattern of the India-Asia collision zone modeled with the LFPM to the precipitation pattern of TRMM2b31Annual (Bookhagen and Burbank, 2010) and the WorldClim2.1 precipitation data (Fick and Hijmans, 2017). The TRMM2b31Annual dataset (availabale at https://people.geog.ucsb.edu/~bodo/TRMM/) is an outcome of the Tropical

- 545 Rainfall Measurement Mission and represents the average annual precipitation based on a 12 years (1998 to 2009) time series. The dataset has a spatial resolution of roughly 5 km and covers the region between 36°S and 36°N. The WorldClim2.1 dataset (availabale at https://www.worldclim.org/data/worldclim21.html) is a global dataset of climate variables with spatial resolutions between 10 arc minutes (~ 18 km) and 30 arc seconds (~ 0.9 km). Monthly precipitation data are averaged for the years from 1970 to 2000 and based on a large number of weather stations. Integrating the average precipitation from January
- to December results in the annual precipitation dataset shown in Figure 7d.
   Simulations of the LFPM were performed on a regular grid with 1 km mesh width for two different directions of atmospheric flow (from south to north and from south-west to north-east). Ocean areas were considered as boundaries, where a uniform influx was assumed. The domain was extended in such a way that each flow line (either from south to north or from south-west
- Several simulations with different parameter values were conducted. However, it is immediately recognized in Fig. 7 that the flow direction has a strong influence on the precipitation pattern. Compared to this influence, the effect of the parameter values is much weaker. In particular, similar results in terms of the root mean square (RMS) deviation were found for different combinations of the parameter values. So a formal fit would not be very useful. Instead,  $L_c = L_f = 25$  km and  $L_1 = 500$  km were chosen as reasonable values according to the considerations in the previous sections. A rather high evaporation ratio
- 560  $\epsilon_0 = 0.75$  was assumed, while lower values would yield similar results with greater values of  $L_1$  according to the findings of Sect. 5. Finally,  $H_0 = 2$  km and  $L_d = 25$  km were assumed. The influx at the boundaries was adjusted automatically in such a way that the average precipitation over the domain matches the respective average TRMM2b31 precipitation (0.99 m yr<sup>-1</sup>), which is very close to the average WorldClim2.1 precipitation (1.00 m yr<sup>-1</sup>).



Figure 7. Comparison of precipitation patterns of the India-Asia collision zone. Precipitation modeled with the LFPM assuming wind from (a) south and (b) southwest. (c) TRMM-based precipitation data (Bookhagen and Burbank, 2010), and (d) precipitation data from the WorldClim2.1 dataset (Fick and Hijmans, 2017).

- While some large-scale properties of the precipitation pattern such as wet regions at the western coast of India (Ghats escarpment) and at the orographic front of the Himalaya and the dry Tibetan Plateau are at least qualitatively reproduced by the LFPM, deviations in precipitation rate between the different datasets are distinct. The root-mean square (RMS) deviation towards the TRMM2b31 dataset for the given parameters with a wind direction from south and from southwest amount  $0.81 \text{ m yr}^{-1}$  and  $0.84 \text{ m yr}^{-1}$ , respectively. The RMS deviations towards the Worldclim2.1 dataset are slightly lower (0.77 m yr}^{-1} and  $0.80 \text{ m yr}^{-1}$ ).
- 570 The RMS deviations can be reduced to about  $0.6 \text{ m yr}^{-1}$  by tuning the parameters. In particular, increasing  $H_0$  goes along with higher precipitation rates in the Tibetan plateau (closer to the measured data) and lower precipitation rates at the windward side of topographic barriers. While this tuning reduces the RMS deviation, it does not necessarily result in a better reproduction of the most striking precipitation features such as high orographic precipitation at the windward side and rain shadows at the leeward side. Furthermore, large values of  $H_0$  would lead to very small orographic effects in other, much lower mountain 575 ranges.
- 575 Tanges.

In general, we should be careful not to compensate principal limitations of the model by potentially unrealistic parameter values. In particular, this applies to the pre-defined uniform wind direction in the LFPM, which cannot describe the atmospheric

circulation pattern of the entire region sufficiently well. Furthermore, obvious differences occur also between the TRMM2b31 and the WorldClim2.1 dataset. Compared with the WorldClim2.1 data, the TRMM2b31 indicates much higher precipitation

<sup>580</sup> rates at the western Himalaya, but distinctly dryer conditions at the eastern Tibetan plateau. These differences suggest that the precipitation rates still involve a considerable uncertainty. The RMS deviation between these two datasets is  $0.42 \text{ m yr}^{-1}$ , which is not far below the deviation of our "best fit" parameter set.

#### 8 Examples of co-evolution of topography and climate

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Similarly to the approaches of Roe et al. (2003), Smith and Barstad (2004), and Garcia-Castellanos (2007), the scope of the model developed in this study is not a precise prediction of precipitation rates, but its combination with long-term landform evolution. This section provides some examples exploring the effect of orographic precipitation and continentality on fluvial landform evolution and the feedback of the resulting topography on the precipitation pattern.

As described in Sect. 1, the SPIM and its derivates can easily be extended by a variable effective precipitation and thus be coupled with our model the LFPM. In the following, we use a model that is not restricted to pure bedrock incision, but also

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takes into account sediment transport. While the idea behind this model dates back to <u>Whipple and Tucker (2002) and</u> Davy and Lague (2009) or partly even to older studies (Howard, 1994; Kooi and Beaumont, 1994), it is used here in the most recent formulation, the so-called shared stream-power model (Hergarten, 2020). The constitutive equation of the shared stream-power model reads

$$\frac{E}{K_{\rm d}} + \frac{Q}{K_{\rm t}A} = A^m S^n,\tag{52}$$

where Q is the sediment flux (volume per time). This model contains two erodibilities, where  $K_d$  describes the erodibility in absence of transported sediment, while  $K_t$  characterizes the ability to transport sediment at zero erosion. For spatially uniform erosion, the sediment flux is Q = EA, and Eq. (52) turns into collapses to a form analogous to the SPIM (Eq. 1) with an effective erodibility K according to

$$\frac{1}{K} = \frac{1}{K_{\rm d}} + \frac{1}{K_{\rm t}}.$$
(53)

Following Robl et al. (2017), we use n = 1 (i.e., the linear version of the model), m = 0.5, and  $K = 2.5 \text{ Myr}^{-1}$ . Studies of natural and experimental river profiles at the transition to a foreland by Guerit et al. (2019) suggest a ratio  $\frac{K_d}{K_t} \approx 1.6$  (G in their notation) for n = 1, which leads to  $K_d \approx 6.5 \text{ Myr}^{-1}$  and  $K_t \approx 4.1 \text{ Myr}^{-1}$ .

The concept of expressing discharges as their catchment-size equivalent (referring to a hypothetic uniform reference precipitation rate) is particularly useful in the context of the shared stream-power model. If both occurrences of A in Eq. (52) are interpreted as catchment-size equivalents of the actual discharge, Eq. (52) remains formally the same, including the values and the units of  $K_d$  and  $K_t$ .

We use a regular mesh of  $2000 \times 2000$  nodes for a domain of 500 km linear size, corresponding to a spatial resolution of 250 m. Although rather coarse, hillslope processes are still relevant at this scale. Using a purely fluvial model would lead to

artificially steep slopes and thus increased heights elevations at the drainage divides, which may affect the precipitation pattern

despite the robustness of the model against the small-scale roughness of the topography. In order to avoid this, we use an approach that was brought into play in the context of debris flows in steep valleys by Stock and Dietrich (2003) and developed further by Hergarten et al. (2016). This approach replaces the term A<sup>θ</sup> in Eq. (1) (or here in Eq. 52) where θ = m/n by A<sup>θ</sup> + A<sup>θ</sup><sub>c</sub>, where θ = m/n and A<sub>c</sub> is a given constant. This modification acts like an increased catchment size or like an increased discharge and thus avoids the occurrence of extremely steep slopes at small catchment sizes. We use A<sub>c</sub> = 1 pixel ≈ 0.06 km<sup>2</sup> here, which roughly consistent with the estimate A<sub>c</sub> = 0.05 km<sup>2</sup> obtained by Hergarten et al. (2016) for the topography of Taiwan.

In the following section, we show how the decrease in precipitation rate with distance to the source of moisture (i.e., continentality) controls the shape and the height of large mountain ranges. Then we illustrate topographic patterns resulting from feedbacks between rock uplift, orographic precipitation, and fluvial erosion.

#### 8.1 Impact of continentality on landform evolution

- The large-scale precipitation pattern over continental areas is controlled by the length scale of long-range moisture transport  $L_1$ . If the extension of a mountain belt in wind direction reaches the order of magnitude of  $L_1$ , the precipitation pattern may have a strong influence on its height and shape even without any immediate effect of elevation on precipitation. In terms of the model parameters, this situation is described by a reference height elevation  $H_0$  much larger than the surface heightelevation. Then the precipitation pattern reflects increasing continentality with an exponential drop in precipitation rate from the moisture source towards the continental inland. The precipitation rate is solely controlled by the influx  $q_{in}$  and the length scale  $L_1$ , which
- is further stretched by considering evaporation.

Figure 6-8 shows the effect of continentality on mountain topography. The considered mountain range is 300 km wide and uplifted at a rate of 0.25 km  $Myr^{-1}$  in all three examples. The two 100 km wide foreland regions are tectonically inactive. Moisture enters the model domain at the southern boundary and is advected towards north. While the geometry, the length

- 630 scales  $L_c = L_f = 25$  km, the height-independent elevation-independent evaporation ratio  $\epsilon = 0.5$ , and the amount of moisture entering the southern boundary are the same in all three scenarios, the length scale  $L_1$  of the long-range transport varies from 50 km to 600 km. Only steady-state topographies are considered, where the term steady state is used in a sloppy way here since the drainage pattern in an inactive foreland permanently reorganizes (Yuan et al., 2019). Since this reorganization has a minor effect on the mountain topography, the mountain range comes close to a steady state with some fluctuations.
- Two effects of continentality must be distinguished. First,  $L_1$  has an influence on the amount of precipitation that the mountain range receives in total. This amount should affect the total height of the steady-state mountain range. It is small if  $L_1$  is small since most of the moisture is already lost in the foreland, but also small if  $L_1$  is large since most of the moisture passes the domain without much precipitation then. So there must be a length  $L_1$  where the amount of precipitation on the mountain range becomes maximal.
- For  $L_1 = 600$  km (Fig. 68a,b), evaporation with  $\epsilon = 0.5$  effectively stretches  $L_1$  to about 1200 km following the considerations of Sect. 5. Since this is four times the width of the mountain range, the precipitation rate varies by a factor of  $e^{\frac{1}{4}} \approx 1.28$  over the mountain range. Differences in discharge are, however, smaller. If the drainage divide is in the middle, the difference in



**Figure 8.** Continentality and steady-state mountain range geometry. Uplift rate ( $U = 0.25 \text{ km Myr}^{-1}$ ), erodibility ( $K = 2.5 \text{ Myr}^{-1}$ ) and factor of evaporation ( $\epsilon = 0.5$ ) are the same in all three experiments. (a, c, e) show perspective views of steady state mountain topography for  $L_1 = 50 \text{ km}$ , 100 km and 600 km, respectively. The black solid line indicates the main drainage divide separating the windward from the leeward side of the mountain range. (b, d, f) are south-north trending swath profiles representing total precipitation (turquoise area) and effective precipitation (blue area) and topography (brown) with average (thick solid line) and extreme values (thin solid lines) taken over the full west-east extent of the model domain.

total precipitation differs only by a factor of  $e^{\frac{1}{8}} \approx 1.13$  between the windward and the leeward half of the mountain range. So the discharges of the big rivers only differ by this factor at the edges of the mountain range.

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This difference is visible in the swath profile (Fig. 68b). The distribution of maximum heights elevations across the mountain ranges range is already quite asymmetric since small catchment sizes at ridge lines and hillslopes cause erosion rate to be directly related to local precipitation rate. Hence, highest domains of the mountain range the highest domains become increasingly steeper towards the leeward side. In contrast, the minimum height elevation of the swath profiles describes the large rivers, which differ not so much in their discharge. So the profile of the minimum height elevation is still quite symmetric here.

650 This also implies that the relative incision of the rivers in relation to the hillslopes is deeper at the leeward side than at the windward side.

According to the findings of Sect. 5, the length scale  $L_1 = 100$  km considered in Fig. 68(c,d) is stretched by evaporation to 206 km. This value is close to the length scale where the mountain range receives the maximum amount of precipitation in total,  $\frac{300\text{km}}{\ln 4} = 216$  km. Consequently, the overall height of the mountain range is quite low here. Since precipitation varies by a factor of  $e^{\frac{300}{206}} \approx 4.3$  here, the topography becomes strongly asymmetric. Again, this asymmetry mainly concerns the maximum

height elevation in the swath profile (Fig. 68d), while the asymmetry of the minimum height elevation referring to the largest

rivers is smaller. Nevertheless, the asymmetry in the minimum height elevation is clearly visible here, and it goes along with a shift of the principal drainage divide towards the leeward side. While the total area drained by the leeward part of the mountain range was 48 % of the total area of the mountain range for  $L_1 = 600$  km, this fraction has decreased to 42 % now. Despite this moderate shift, the highest peaks are already separated from the main drainage divide.

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For  $L_1 = 50$  km (Fig. 68e,f, effectively 114 km with evaporation), the total amount of precipitation on the orogen decreases. This result results in an increasing overall surface heightelevation. More importantly, the topography becomes extremely asymmetric since the precipitation rate varies by a factor of  $e^{\frac{300}{114}} \approx 14$  over the mountain range. This variation is strong enough to make the river profiles (minimum height elevation in Fig. 68f) strongly asymmetric. The overall asymmetry is so strong that is it also dominates the mean elevation. Apart from very high peaks close to the leeward border of the mountain range, the maximum highest mean elevation is also achieved there, while the version with  $L_1 = 100$  km featured an almost constant mean

height elevation over the leeward part of the mountain range. In turn, the shift of the main drainage divide is only moderate

- compared to the previous scenario. The leeward fraction of the total drained area has decreased from 42 % to 39 %. As a consequence, the large massifs that have formed in the northern part drain almost entirely towards the leeward side. So rivers 670 starting from high regions partly drain towards south first, but then change their flow direction towards the large north-trending
  - valleys.

#### 8.2 Orographic precipitation controlling mountain range geometry

We finally consider the effect of topography on the precipitation pattern and the resulting feedback on landform evolution. The overall geometry and the parameter values are the same as before, except for a fixed length scale  $L_1 = 500$  km, which was chosen in such a way that the effect of continentality over the mountain range is rather weak. In contrast to the previous 675 examples, transversal dispersion is relevant here, where  $L_d = 5$  km was chosen.

While the vertical length scale could be defined arbitrarily based on the erodibility and the uplift rate in the previous examples, it is defined here by the reference height elevation  $H_0$  that describes the decrease of  $\beta$  and  $\epsilon$  with height elevation. We use a fixed value  $H_0 = 1$  km and consider scenarios with different uplift rates.

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The results shown in Fig. 9 reveal a distinct difference not only in mountain height, but also in mountain range asymmetry and spatial gradients in precipitation rate. As expected, mean and peak elevation increase with uplift rate. In strong contrast to scenarios of uniform precipitation, the highest mean and peak elevations are shifted towards the leeward side of the mountain range. The observed asymmetry with a gentle increase in elevation on the windward side and a strong decrease on the leeward side increases with uplift rate. In all scenarios, the highest rates of effective precipitation occur at the windward side 685 of the mountain range, but these spatial gradients in precipitation rate increase distinctly with uplift rate. At an uplift rate of 1.5 km Myr<sup>-1</sup>, the average effective precipitation decreases by a factor of about five from the windward to the leeward mountain front (Fig. 9i). The principal drainage divide is shifted towards the leeward side with increasing precipitation gradient and uplift rates, but to a much lesser extent than the distribution of mountain heights would suggest.

As illustrated in Fig. 10, the relationship between uplift rate and mountain height becomes nonlinear in contrast to simple scenarios assuming a uniform precipitation rate. At small uplift rates, the behavior is dominated by the increase in precipita-690



**Figure 9.** Impact of uplift rate on the precipitation pattern and on mountain geometry for  $K = 2.5 \text{ Myr}^{-1}$  and  $L_t L_t = 500 \text{ km}$ ,  $L_c = L_f$  $L_c = L_f = 25 \text{ km}$ ,  $L_d = 5 L_d = 5 \text{ km}$  and  $\epsilon = 0.5$ . (a, d, g) show steady-state mountain topographies representing uplift rates of 0.5 km Myr<sup>-1</sup>, 1.0 km Myr<sup>-1</sup> and 1.5 km Myr<sup>-1</sup>. The black solid line indicates the main drainage divide. Magenta dots mark the position of maximum precipitation in windward direction. (b, e, h) show the corresponding precipitation patterns and (c, f, i) are south-north trending swath profiles representing topography (brown) and effective precipitation (blue) with average (thick solid line) and extreme values (thin solid lines) taken over the full west-east extent of the model domain.



Figure 10. Uplift rate control on precipitation rate and mountain height. Mean and maximum values for precipitation and elevation are computed for the domain of the mountain range only.

tion with increasing topography, which results in higher erosion rates. As a consequence, the topography still increases with uplift rate, but the increase is weaker than linear. For the scenario considered here, this holds for uplift rates of up to about  $0.5 \text{ km Myr}^{-1}$ .

- The concavity of the relation between uplift rate and topography is lost at higher uplift rates. The limited amount of moisture supplied from the boundary plays a central part here. As a consequence, the mean effective precipitation rate approaches a constant value for large uplift rates. However, even a constant mean precipitation rate does not imply a linear relation between uplift rate and topography since the spatial distribution of the precipitation becomes increasingly inhomogeneous. This effect is recognized in the maximum precipitation rate in Fig. 10, which continuously increases with increasing uplift.
- Figure 11 illustrates the relation between topography and precipitation for the three considered uplift rates. A bimodal distribution is found at low elevations. As shown in Fig. 9(c,f,i), low elevations occur along big valleys close to the boundaries of the mountain range. Since precipitation decreases systematically from the windward side to the leeward side, the low-elevation range splits up into a rather wet windward domain and a rather dry leeward domain. This distinction is, however, lost with increasing surface height elevation since intermediate elevations are distributed over the entire mountain range. This goes along with a rapidly increasing variability in precipitation at given elevation.
- While some decline of the increase in precipitation with elevation is already visible for U = 0.5 km Myr<sup>-1</sup>, it even turns into an absolute decrease at large elevation. The highest precipitation rates are found at  $H \approx 2$  km for U = 1 km Myr<sup>-1</sup> as well as for U = 1.5 km Myr<sup>-1</sup> and decrease above this elevation. This decrease is not an immediate effect of the height elevation since the model itself predicts a continuous increase in precipitation with elevation at a given moisture content. As discussed above, it arises from the limited amount of moisture supplied from the windward boundary. So the occurrence of the highest
- 710 precipitation rates at  $H \approx 2$  km is not only related to the parameters of the precipitation model, but also to the properties of the erosion model. As a further consequence, an extreme variation in precipitation occurs at  $H \approx 2$  km with high rates at the windward side and very dry regions in the shadow or high mountains where most of the available moisture has already been consumed.



Figure 11. Relationship between surface elevation and precipitation for varying uplift rates (scenarios are shown at Fig. 9).

The decrease in precipitation at large elevations results in a strong interaction with landform evolution. Since the erosion rate at a given channel slope decreases then, an equilibrium between uplift and erosion can only be achieved by increasing the channel slopes. Since this also requires increasing heightselevations, a positive feedback occurs. This feedback is visible as a convex relation between uplift rate and elevation in Fig. 10, which means that elevation increases stronger than linearly with uplift rate. This effect is particularly strong in the maximum elevation. It corresponds to the formation of very high peaks close to the leeward boundary of the mountain range (Fig. 9e,i), while the major valleys between these peaks are not particularly high.

While the precipitation pattern explains several properties of the resulting topography, we should keep in mind that the erosion rate depends on the discharge and not on the local precipitation rate. A consequence of this difference is recognized in the leeward foreland in Fig. 9. While the precipitation rate is overall low here, the topography becomes highly variable for  $U = 1.5 \text{ km Myr}^{-1}$ .

- Huge alluvial fans form behind the highest regions (at  $x \approx 200$  km and at  $x \approx 400$  km). Their occurrence is related to the low precipitation in the northern foreland. Figure 12(a) reveals that the respective catchments are quite small and completely in the precipitation shadow of the large massifs. This results in a very low discharge and thus in a limited ability to transport the sediment coming from the high mountain region. In equilibrium, the low discharge must be compensated by a high channel slope, which leads to the formation of the huge alluvial fans.
- The regions between these fans feature rivers with large catchments, which reach deep into the mountain range up to the principal drainage divide. Since a part of the moisture coming from the windward boundary passes the principal drainage divide, parts of these catchments are exposed to high precipitation. As a consequence, the respective rivers feature rather highdischarges discharges are rather high, although the precipitation rate in the leeward foreland is overall low. Therefore, these the respective rivers are able to carry the sediment coming from the mountain region without forming large alluvial fans.
- Figure 12(c) shows that the windward foreland also features rivers with strongly different ratios of discharge and catchment size. While the reason for this variation is basically the same as in the leeward foreland, the variation is less pronounced here



**Figure 12.** Spatial distribution of precipitation and discharge for U = 1.5 km Myr<sup>-1</sup>, K = 2.5 Myr<sup>-1</sup>,  $L_1 = 500$  km,  $L_c = L_f = 25$  km,  $L_d = 5$  km, and  $\epsilon = 0.5$ . Topography and precipitation pattern of this scenario is shown on Fig. 9 (right-right-hand column). Channels color-coded for (a) contributing drainage area and (b) river discharge as catchment-size equivalent  $A_{eq}$ . (c) ratio of discharge  $A_{eq}$  and catchment size A. All channels with a catchment size  $A \ge 25$  km<sup>2</sup> are considered. The black solid line follows the main drainage divide. (d) Relationship between catchment size and discharge at the windward (blue dots) and the leeward (red dots) side of the mountain range. Dark colors represent the mountain range and light colors the forelands.

since the windward foreland region is exposed to a higher precipitation than the leeward foreland. Concerning the resulting topography, however, the main difference between the two foreland regions consists in the presence of low-discharge rivers bringing sediments from the mountain range to the leeward foreland. In the windward foreland, rivers with low discharge to

catchment-size ratio typically have their source in the foreland itself and thus carry only a small amount of sediment. Therefore,

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As shown in Fig. 12(d), the difference in the discharge characteristics between the leeward side and the windward side is not restricted to the foreland regions. The discharge at any given catchment size  $A > 10 \text{ km}^2$  varies by less than a factor of 2 at the windward side, while the variation at the leeward side is higher.

745 Following individual rivers downstream, the change in the discharge characteristics is opposite in both domains. It is recognized in Fig. 12(c) that rivers originating close to the principle drainage divide start with similar discharge to catchment-size ratios at both sides. However, tributaries at the windward side are rather exposed to higher precipitation, so that the discharge to catchment-size typically increases downstream at the windward side until the rivers reach the foreland. In turn, tributaries at the leeward side are typically quite dry and thus cause a downstream decrease in the discharge to catchment-size ratio. As a consequence, equilibrium profiles of tributaries at the leeward side are rather steep compared to the main rivers, which 750

corresponds to a deeper incision of the large river valleys than at the windward side.

#### 9 Scope, limitations, and perspectives

the windward foreland features no big alluvial fans.

After performing some simple comparisons of the LFPM with existing models and exploring its potential in the context of landform evolution modeling, we now recapitulate what the LFPM is and what it is not.

755 As discussed in Sect. 6, the LFPM has some advantages over the models proposed by Smith and Barstad (2004) and by Garcia-Castellanos (2007). However, all these models share the restriction to pre-defined atmospheric flow patterns. This restriction reduces not only the numerical complexity extremely in comparison to regional climate models, but also the predictive power.

At the actual level, models of this type are particularly useful for theoretical considerations of the co-evolution of topography and climate. There are numerous open questions not only about the overall asymmetry of mountain ranges, but also about 760 asymmetries at smaller scales (particularly individual drainage divides, e.g., Trost et al., 2020) or the longevity of large plateaus. In a first step, such theoretical studies, where typically artificial topographies are used under well-defined conditions, aim at a principal understanding. The second step, however, is finding out what topographic signatures can tell about the climatic conditions in the past.

765 When leaving the realm of theoretical studies and sensitivity experiments and looking at real orogens in the geologic past, additional challenges arise. Large changes in topography do not only affect the precipitation pattern within an orogen, but may even change the global climate. As an example, Takahashi and Battisti (2007) found that the Andes play a central part for the climatic north-south asymmetry around the equator. So at least the input of moisture at the windward boundary and probably also the pre-defined direction of the atmospheric fluxes would have to be taken into account, e.g., by coupling the model to a

770 general circulation model (GCM).

While general circulation models have played a central part in palaeoclimate reconstructions, the recent study of Mutz and Ehlers (2019) on properties that are particularly relevant for Earth surface processes. This direction of research can be seen as a first attempt to approach the co-evolution of topography and climate from large scales. So it is somehow complementary to theoretical studies and sensitivity experiments with landform evolution models. Coupling GCMs with landform evolution models and

775 simple models of orographic precipitation such as the LFPM might become a point where the two complementary approaches meet in the future.

#### 10 Conclusions

This study presents a new model for orographic precipitation for use in large-scale landform evolution models such as the SPIM or the shared stream-power model. The goal was to arrive at a model that goes clearly beyond the simplest concepts

such as predicting the precipitation precipitation rate directly from surface height elevation or local slope, but to stay at a level of complexity consistent with simple landform evolution models. In particular, the numerical complexity should not be much higher than that of the respective landform evolution models.

We arrived at a model with The linear feedback precipitation model (LFPM) developed in this study describes two moisture components, which are interpreted as vapor and cloud water. In contrast to previous models used in this context, a two-way

785 conversion between both components was assumed without considering a thermodynamic equilibrium explicitly. While this concept, where an equilibrium develops evolves dynamically, seems to be more complicated first, it helps to navigate around some problems and requires little further assumptions.

As a key property, our model the LFPM captures a decrease in precipitation with increasing distance from the ocean (or any other source of moisture). This decrease is very slow over large continental areas with little topography, but becomes faster if

- 790 orographic precipitation at large mountain ranges consumes a considerable part of the available moisture. While precipitation overall increases with elevation in the model, it may decrease again at high elevations due to the limited amount of moisture. As a second important property, precipitation responds to changes in topography not instantaneously, but with a finite length scale. Therefore, the model is not sensitive to the small-scale roughness of the topography and can be operated without any additional smoothing.
- The length scale of the decrease in precipitation due to the limited amount of water and the length scale of the response to changes in topography can be computed from the velocity of transport in the atmosphere and the time scales of the conversion between vapor and cloud water and of the fallout of precipitation. The model structure proposed here is in principle the minimum model that is able to reproduce a long-range transport and a response to changes in topography with a finite length scale.
- 800 The model also includes dispersion of the moisture fluxes in direction perpendicular to the main transport direction. This component of the model is particularly useful in combination with two-dimensional landform evolution models since pre-

cipitation shadows of infinite length would occur behind individual peaks otherwise. Numerically, the dispersion is the most expensive part of the model. However, it can be implemented as a series of one-dimensional diffusion problems as long as the main direction of transport follows one of the principal coordinate axes. The numerical complexity is still linear then,

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which means that the computing effort increases only linearly with the total number of nodes of the grid. Since contemporary, fully implicit numerical schemes for the respective erosion models are also of linear complexity, this property is essential for preserving the high numerical efficiency of these models.

The model can easily be extended by a simple model of evapotranspiration where a height-dependent elevation-dependent fraction of the precipitation is returned to the atmosphere. While this extension increases the length scale of long-range transport further, it does not change the properties of the model fundamentally.

Even the simple examples presented in this study show the remarkable impact of continentality and orographic precipitation on mountain range geometry and the <u>coevolution co-evolution</u> of topography and precipitation pattern. Future studies can use this numerically efficient approach to address a wide range of research questions in the field of landscape evolution, where the assumption of uniform precipitation is too simple to explain landscape metrics and topographic pattern.

- 815 Code and data availability. Codes and results of the simulations are available at the FreiDok data repository 219131 (Hergarten and Robl, 2021). The open-source landform evolution model OpenLEM is freely available at http://hergarten.at/openlem, which also contains an implementation of the LFPM. Interested users are advised to download the most recent version of OpenLEM or the respective standalone version of the LFPM. The authors are happy to assist interested readers in reproducing the results and performing subsequent research.
- *Video supplement.* The video supplement includes the respective time-dependent simulations of Sect. 8.2 and a reduced version of Fig. 12 optimized for color-blind readers.

*Author contributions.* S.H. developed the theory and the main parts of the codes. J.R. performed the simulations and analyzed the data. Both authors wrote the paper.

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