

## RESEARCH ARTICLE

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# Physical context for theoretical approaches to sediment transport magnitude-frequency analysis in alluvial channels

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### Key Points:

- We test and expand on theoretical approach to sediment magnitude-frequency analysis
- PDFs representing river flow overweight effectiveness of infrequent flows
- Adding complexity to theoretical approach helps explain empirical findings

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**Abstract** Theoretical approaches to magnitude-frequency analysis (MFA) of sediment transport in channels couple continuous flow probability density functions (PDFs) with power law flow-sediment transport relations (rating curves) to produce closed-form equations relating MFA metrics such as the effective discharge,  $Q_{eff}$ , and fraction of sediment transported by discharges greater than  $Q_{eff}$ ,  $f+$ , to statistical moments of the flow PDF and rating curve parameters. These approaches have proven useful in understanding the theoretical drivers behind the magnitude and frequency of sediment transport. However, some of their basic assumptions and findings may not apply to natural rivers and streams with more complex flow-sediment transport relationships or management and design scenarios, which have finite time horizons. We use simple numerical experiments to test the validity of theoretical MFA approaches in predicting the magnitude and frequency of sediment transport. Median values of  $Q_{eff}$  and  $f+$  generated from repeated, synthetic, finite flow series diverge from those produced with theoretical approaches using the same underlying flow PDF. The closed-form relation for  $f+$  is a monotonically increasing function of flow variance. However, using finite flow series, we find that  $f+$  increases with flow variance to a threshold that increases with flow record length. By introducing a sediment entrainment threshold, we present a physical mechanism for the observed diverging relationship between  $Q_{eff}$  and flow variance in fine and coarse-bed channels. Our work shows that through complex and threshold-driven relationships sediment transport mode, channel morphology, flow variance, and flow record length all interact to influence estimates of what flow frequencies are most responsible for transporting sediment in alluvial channels.

## 1. Introduction

To what discharge or range of discharges does a river adjust its dimensions to balance the inputs of flow and sediment while maintaining a dynamically stable form? This question underlies research conducted by generations of geomorphologists and engineers on the relationship between alluvial channel form, sediment transport, and flow regime [e.g., Mackin, 1948; Wolman and Miller, 1960; Pickup and Warner, 1976; Hey and Thorne, 1986; Emmett and Wolman, 2001; Doyle et al., 2007]. Alluvial channels are those with boundaries that adjust in response to erosion and deposition of sediment. Wolman and Miller [1960] introduced the hypothesis that the theoretical channel-forming discharge is some intermediate, near-bankfull discharge that, over time, performs the most work (i.e., transports the most sediment). They define this discharge as the most “effective” discharge,  $Q_{eff}$ . Since then, scores of studies searching for a relationship between channel form and  $Q_{eff}$  have been published. Some workers have found a strong (e.g., 1:1) relationship between the bankfull discharge,  $Q_{br}$ , and  $Q_{eff}$  [Andrews, 1980; Andrews and Nankervis, 1995; Hey, 1996; Emmett and Wolman, 2001; Torizzo and Pitlick, 2004] while others have found a wide range of variability in the  $Q_{br} - Q_{eff}$  relationship [Pickup and Warner, 1976; Nolan et al., 1987; Soar and Thorne, 2001]. Nevertheless, the concept of effective discharge—and the analytical framework of magnitude and frequency analysis of sediment transport—has provided a valuable tool for examining relationships between channel form and process.

Much work has been conducted to operationalize and standardize empirical magnitude-frequency analysis (MFA) for use on rivers and streams with flow records and measured or modeled sediment transport [e.g., Benson and Thomas, 1966; Biedenharn et al., 2000]. Empirical MFA involves representing a daily or subdaily flow record as an empirical probability distribution through either binning the flows in a histogram [Beidenharn et al., 2000; Soar and Thorne 2001] or numerically differentiating the empirical cumulative distribution function of the flows [Orndoff and Whiting, 1999]. This empirical probability distribution is then multiplied

by a sediment transport-discharge relation, which may either be a statistical regression, or a site-calibrated sediment transport equation [e.g., Hey, 1996] to create an empirical effectiveness histogram or curve.

While *Wolman and Miller* [1960] originally suggested that a continuous, theoretical probability density function (PDF) could be used to represent the flow regime, it was not until three decades later that this theoretical approach to MFA was formalized [Nash, 1994; Vogel et al., 2003; Goodwin, 2004; Quader and Guo, 2009; Klonsky and Vogel, 2011]. The theoretical approach to MFA involves multiplying an assumed continuous PDF or one that is fit to the flow distribution (e.g., the lognormal or gamma distribution) with a sediment-transport relation, which may be as simple as a power law function that relates sediment transport to flow, or a more complex and threshold driven relation. Metrics based on the resulting effectiveness curve equation may then be derived by analytical integration. The appeal of the theoretical approach to MFA lies in the ability to generate easily applied, closed-form solutions to MFA metrics such as  $Q_{eff}$  [Goodwin, 2004] and the amount of sediment transported by discharges greater than  $Q_{eff} f+$  [Vogel et al., 2003]. With these, one can expediently determine the relationship between MFA metrics, and attributes of the flow regime (e.g., coefficient of variation, skewness, etc.) and/or sediment transport mode (e.g., empirical sediment rating curve exponent, and critical shear stress for bed mobilization). Furthermore, one could use these relations to predict how a channel might respond to a change in flow variability or sediment supply due to environmental change assuming a correlation between  $Q_{eff}$  or another MFA metric, and  $Q_{bf}$ .

Using the theoretical approach, Vogel et al. [2003] found that  $Q_{eff}$  often takes on a relatively low value (and  $f+$  a large value) and is responsible for relatively little load transport over time while larger, less frequent discharges are often responsible for the majority of load transport in rivers. They argue that  $Q_{eff}$  may not be a useful metric when considering what flows are responsible for transporting the bulk of suspended sediment in a channel. It should be noted that Vogel et al. [2003] were more interested in total river load in general (solutes, suspended sediment, etc.), and not specifically in geomorphically significant flows. From a geomorphic perspective, many empirical MFA studies have found correspondence between  $Q_{eff}$  and  $Q_{bf}$  suggesting that some relationships exist between the discharge range that maximizes the effectiveness of sediment transport and channel form in certain channel types [Wolman and Miller, 1960; Andrews, 1980; Carling, 1988; Hey, 1996; Emmett and Wolman, 2001]. Here, we explore why theoretical and empirical approaches can produce contradictory results.

The present study takes a dualistic approach to investigate claims on the magnitude and frequency of sediment transport in channels based on theoretical, closed-form solutions to MFA metrics. We utilize the analytical framework of the theoretical approaches to study how adding complexity to them changes the predicted relationships between flow regime, sediment transport mode, and MFA metrics. For this first objective, we begin by considering the influence of flow and sediment transport mode on MFA metrics using the original theoretical approaches (sections 3.1 and 4.1). As discussed above, we acknowledge the limitations of these approaches; however, we find it illustrative to begin this study by exploring the relationships they produce. To add complexity to these approaches, we introduce a compound channel form (sections 3.3 and 4.3) and a threshold for sediment entrainment (sections 3.4 and 4.4) and consider the influence of flow variability and sediment transport mode on MFA metrics calculated from these updated theoretical approaches. For the second objective, we test the assumptions of the theoretical approaches themselves by considering how MFA metrics calculated from theoretical approaches, which use continuous PDFs to represent the flow record, compare with those calculated with a synthetic empirical approach using discrete, finite, flow records sampled from those same PDFs (sections 3.2 and 4.2).

We begin with a more thorough introduction to theoretical MFA approaches and outline our methods for accomplishing the objectives stated above. We end with a discussion of how and why results from theoretical and empirical approaches diverge. We also explore how theoretical approaches can be extended to incorporate a higher degree of physical realism, which in turn allows them to be used to evaluate more complex relationships between channel form and the magnitude and frequency of sediment transport.

## 2. Theoretical Framework

This investigation follows and expands upon the analytical framework of previous theoretical MFA work [Nash, 1994; Vogel et al., 2003; Goodwin, 2004]. Consistent with this previous work, we initially represent the sediment transport-discharge relationship as a power law:  $Q_s = \alpha Q^\beta$ , where  $Q_s$  has units of mass/time,

specifically (tonnes/day). In this sediment rating, curve  $\alpha$  is a scaling coefficient that is positively related to the magnitude of sediment flux and drainage area [Syvitski *et al.*, 2000; Barry *et al.*, 2004]. Implicit in this rating curve is a discharge-bed shear stress relationship. It has been shown that the value of  $\alpha$  does not affect the value of  $Q_{eff}$  or other normalized MFA metrics [Nash, 1994; Goodwin, 2004], so it will not be specifically considered in this study. The rating curve exponent,  $\beta$ , is positively correlated to the size of the largest bed particles ( $D_{84}$ ) [Emmett and Wolman, 2001], bed armoring [Barry *et al.*, 2004], and dependent upon sediment transport measurement technique [Bunte *et al.*, 2004], as well as channel morphology (i.e., stage-discharge relationship) [Hey, 1996] among other factors.

The mechanisms by which sediment moves through a channel (e.g., in suspension or along the bed) should inform the type of transport relation used. Where sediment transport measurements exist, a statistical regression may be used, often taking the form of a power law function (sediment rating curve). Where empirical sediment rating curves are not available, semiempirical, sediment transport relations, calibrated to the hydraulics and sediment of the channel of interest, are relied upon. Barry *et al.* [2008] found that the calculated value of  $Q_{eff}$  is insensitive to the type of transport equation used in bed load channels.

Many continuous probability distribution functions have been used to represent daily stream flow, which are generally highly positively skewed, including the two-parameter lognormal, gamma, Generalized Pareto, exponential, as well as broken power law functions [e.g., Vogel *et al.*, 2003; Goodwin, 2004; Archfield *et al.*, 2007; Quader and Guo 2009; Segura and Pitlick, 2010]. In general, continuous PDFs fit natural flow records with mixed results, especially in the right tail of the distribution and in multimodal cases [Nash, 1994; Segura and Pitlick, 2010]. Nash [1994] found that on large rivers the lognormal distribution fit daily flows well in some circumstances and poorly in others due to the multimodal nature of some flow records, as well as skewness and kurtosis combinations that exceeded what is possible with the lognormal distribution. Quader and Guo [2009] tested the fit of the exponential distribution on daily flows, finding that it performs the best in smaller streams but found poor fits between flow records and continuous PDFs in general, especially among streams with intermittent flow. Segura and Pitlick [2010] found that a broken power law function better fit the frequency distribution of daily flows in snowmelt-dominated streams, as compared to the exponential and lognormal distributions. While it does not fit daily flow distributions well in some cases, we chose to work with the two-parameter lognormal distribution function due to its demonstrated ability to represent skewed daily stream flow distributions in many cases [Limbrunner *et al.*, 2000], its relative parsimony, and its historical use in generating theoretical MFA relationships [Wolman and Miller, 1960; Nash, 1994; Vogel *et al.*, 2003; Goodwin, 2004].

$$f(Q) = \frac{1}{Q\sqrt{2\pi\sigma_y^2}} \exp\left\{-\frac{1}{2\sigma_y^2} [\ln(Q) - \mu_y]^2\right\} \quad (1)$$

Here,  $Q$  represents the average daily flow value ( $m^3/s$ ), and  $\mu_y$  and  $\sigma_y$  are the mean and standard deviation of the logarithm of the average daily flows, respectively. Using other skewed, continuous PDFs such as the gamma distribution produced qualitatively similar theoretical relationships as the lognormal distribution. It is possible for the exponential distribution to have a relatively thick right tail for large values of  $C_v$  when fit using the method of moments. This can lead to a negative relationship between  $f+$  and  $C_v$  (opposite of the relationship produced using lognormal or gamma PDFs); however, such thick right tails may not be realistic for natural flow regimes. Also, it should be noted that a subdaily time resolution may be more appropriate for analyzing sediment yield in rivers whose discharge may vary widely within a day such as those with small drainage areas and flashy hydrology [Biedenbarn *et al.*, 2000]; however, for the purposes of this study, we only consider flow regimes with daily time resolution.

Flow records are samples of the underlying population distribution of the flow regime and are discrete and finite in nature. This is particularly evident in the right tail of the distribution where continuous PDFs may overrepresent the discrete, sporadic occurrence of infrequent flood events. Even if a flow record perfectly represents a sample from a certain probability density function, an infinite sample size would be required before the empirical PDF would match the shape of theoretical PDF. As the period of record length increases past 50–100 years and beyond, assumptions of channel equilibrium and flow regime stationarity inherent in MFA may be violated. As such, continuous PDFs will always approximate finite flow records due to their discrete nature. Nevertheless, results from MFA using continuous PDFs can yield important insights

about the relationships between flow regime and the magnitude and frequency of sediment transport [Vogel *et al.*, 2003; Goodwin, 2004; Quader and Guo, 2009; Klonsky and Vogel, 2011].

Vogel *et al.* [2003] and Goodwin [2004] demonstrate that a closed-form solution for the effective discharge can be derived by multiplying a continuous PDF with a sediment-rating curve to create the effectiveness curve. The flow that coincides with the peak of the effectiveness curve, found by taking its derivative, is known as the effective discharge. The resulting expression is a parsimonious, closed-form function of the rating curve exponent,  $\beta$ , and the mean and variance of the logarithms of daily flow when the lognormal PDF is used:

$$Q_{eff} = \exp \left[ \mu_y + \sigma_y^2 (\beta - 1) \right] \quad (2)$$

Many methods exist to calculate the value of  $Q_{eff}$  directly—or empirically—from a flow record and either a measured sediment-rating curve or calibrated sediment transport relation [e.g., Hey, 1996; Biedenharn *et al.*, 2000; Soar and Thorne, 2001]. Generally,  $Q_{eff}$  is equal to the median value of the discharges contained in the maximum effectiveness histogram bin, which is the product of a daily flow histogram and the sediment transport relation. It can also be determined with an empirical kernel density function [Klonsky and Vogel, 2011] or as the maximum finite difference derivative of the empirical cumulative distribution form of the effectiveness curve [Orndorff and Whiting, 1999].

Based on the lognormal distribution for daily flows, the return interval in years of  $Q_{eff}$  is:

$$RI = \frac{1/365}{1 - \Phi \left[ \frac{\ln(Q_{eff}) - \mu_y}{\sigma_y} \right]} \quad (3)$$

where the expression  $\Phi[ ]$  represents the standard normal cumulative distribution function (CDF) [Vogel *et al.*, 2003]. Here,  $RI$  represents the return interval in years calculated from the daily flow series PDF. We do not use a nonparametric or empirical alternative to equation (3) in this study because we are sampling from the lognormal distribution. Additionally, Vogel *et al.* [2003] derived a closed-form solution for the fraction of average total sediment load transported by discharges greater than  $Q_{eff}$ ,  $f+$ :

$$f+ = 1 - \Phi \left[ -\sqrt{\ln(1 + C_v^2)} \right] \quad (4)$$

where  $C_v$  is the coefficient of variation of the untransformed daily flows ( $\sigma_x/\mu_x$ ). This function monotonically increases with  $C_v$  with an asymptote at unity. The empirical analog to the theoretical approach simply involves dividing the total amount of sediment transported on each day summed over a flow record by the amount of sediment transported by flows greater than  $Q_{eff}$ .

### 3. Data and Methods

#### 3.1. Flow Regime Analysis

We begin by considering the range of variance in natural flow regimes. Poff [1996] conducted an analysis of the statistical properties of daily flows in unregulated streams and rivers in the conterminous United States. He created flow regime categories by grouping rivers by various statistical properties. We select several of his flow regime categories representing the range of variance he reports from groundwater and snowmelt-driven hydrology to flashy and intermittent hydrology ( $1 < C_v < 5$ ). To understand how flow regime variance—represented by the coefficient of variation of the average daily flow—affects the magnitude and frequency of sediment transport, we solve equations (2), (3), and (4) for this range of values of  $C_v$ . We also use this range of  $C_v$  values to inform the subsequent analyses.

#### 3.2. Flow Record Length

Our first test of the theoretical approach to magnitude frequency analysis (MFA) compares values and return intervals of  $Q_{eff}$  and values of  $f+$  generated from equations (2), (3), and (4) with those generated from synthetic daily flow records of varying length (10, 100, 1000, and 100,000 years) sampled from the lognormal distribution. We create these extremely long flow records (large sample sizes) to examine how empirical MFA metrics compare to theoretical values as the flow record sample approaches the continuous, underlying population distribution (the lognormal PDF) used in the theoretical approach. Using 1000–100,000 year records will increase the probability of sampling a large and rare event, but these large events

will receive less weight in the empirical density function for large sample sizes, and hence less influence on MFA. In fact, a large flood sampled in a short flow record, will have an overwhelming influence on MFA because it will receive more weight in the histogram (higher density) due to the smaller sample size. To generate synthetic daily flow records for each combination of  $C_v$  value (0.5–5) and flow record length ( $RL$ ) considered, we used a uniform distribution to randomly sample the two-parameter lognormal CDF specified by a constant mean ( $\mu_x$ ) of  $2 \text{ m}^3/\text{s}$  (arbitrary value) and  $C_v$  values ranging from 0.5 to 5. For each flow record length, we created 100 trials of  $RL \times 365$  random samples from the lognormal CDF for every value of  $C_v$ . The mean and variance of the lognormal distribution are calculated by the method of moments where the values in parentheses are untransformed [Yevjevich, 2010]:

$$\mu_y = \frac{1}{2} \ln \left( \frac{\mu_x^2}{1 + C_v^2} \right) \tag{5}$$

$$\sigma_y^2 = \ln (1 + C_v^2) \tag{6}$$

Next, we created an empirical flow PDF or histogram of the synthetic flow record. Much consideration has been given to the number of histogram bins and method for calculating the bin intervals in effective discharge analysis with suggestions ranging from 25 to 100 equally spaced (arithmetic) discharge classes and discouraging the use of logarithmic classes [Biedenharn et al., 2000; Soar and Thorne, 2001]. More rigorous statistical approaches have been suggested by Orndoff and Whiting [1999] who use a numerical differentiation of the empirical flow CDF, and Klonsky and Vogel [2011] who recommend using a kernel density function. For simplicity, we use the general approach outlined by Biedenharn et al. [2000]. We modify their method slightly to best represent flow record lengths ranging from 10 to 100,000 year by using a constant 50 equally space arithmetic bins to create histograms of daily flow. Additionally, we do not modify the width of discharge bin classes such that no bins contain zero flows as per Biedenharn et al. [2000]. Sensitivity analysis indicates that relative relationships among the MFA metrics and  $C_v$ ,  $\beta$ , and  $RL$  variables are not affected by the number of bins (bin width) used for  $25 \leq \# \text{ of bins} \leq 100$ . The midpoints of each histogram bin are then multiplied by sediment-rating curves of the form  $Q_s = \alpha Q^\beta$  to generate the synthetic “empirical” effectiveness histograms. The median value of all the daily discharges contained in the maximum effectiveness histogram bin represents the effective discharge.

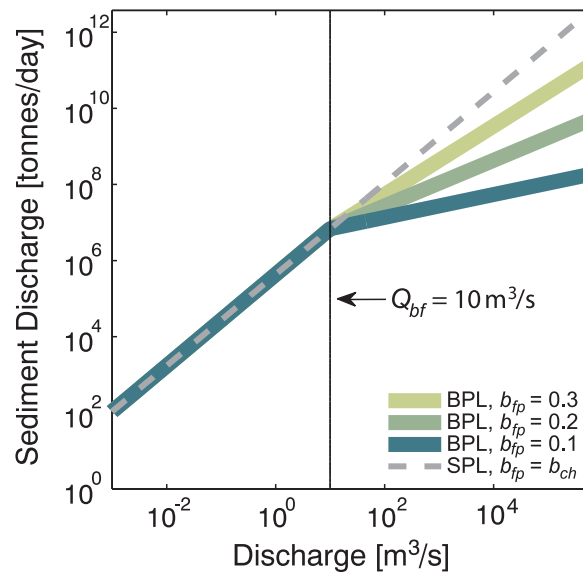
The coefficient of the rating curve,  $\alpha$  was arbitrarily set to 0.02. The value of  $\alpha$  does not affect the value of  $Q_{eff}$  [Nash, 1994; Goodwin, 2004] or normalized MFA metrics such as  $f+$ ; therefore, keeping this value constant and arbitrary was deemed reasonable. We consider values of the exponent  $\beta$  from 0.5 to 5. This range represents the spectrum of observed sediment-rating curve exponent values where smaller values as low as 1 are generally associated with suspended sediment transport [Nash, 1994; Syvitski et al., 2000]. Values less than 1 are uncommon. Larger values of  $\beta$  up to and greater than 5 are generally associated with bed load transport [Emmett and Wolman, 2001; King et al., 2004; Pitlick et al., 2009]. These ranges are not exhaustive; indeed, values of  $\beta$  up to and greater than 10 have been reported for bed load transport in mountain streams with relatively low transport stages [Bunte et al., 2004]. However, the range of  $\beta$  selected for this study serves to illustrate the relationship between sediment transport mode, as represented by the rating curve exponent,  $\beta$ , over the range of flow regimes.

We summarize the empirical MFA metric results as a function of  $C_v$ ,  $\beta$ , and  $RL$  by reporting median values from the 100 trials. Increasing the number of trials from 100 to 1000 and 10,000 does not significantly alter the median value of the MFA metrics, nor does it influence the trends and relationships reported here.

### 3.3. Compound Channel Form

Next, we compare theoretical approaches to MFA derived from the single power law (SPL) sediment-rating curve function—equations (2) to (4)—to those generated using a piecewise or broken power law (BPL) function that represents a compound channel form consistent with many natural channel cross sections. Compound channels exhibit a break in lateral slope between the channel and the floodplain and hence a break in transport effectiveness [Hey, 1996] (Figure 1). We consider how flow variance interacts with compound channel form to drive sediment transport effectiveness.

We use an at-a-station hydraulic geometry relation of the form  $h = aQ^b$  to relate flow depth,  $h$ , to discharge for both in channel and overbank flows. Values of  $a$  and  $b$  were chosen to generally reflect reported values for in-channel hydraulic geometry relations [Knighton, 1998, p. 173]. We set the value of the in-channel



**Figure 1.** Log linear sediment-rating curves for single power law (SPL, broken line) and broken power law (BPL, solid lines) at-a-station hydraulic geometry relationships for in-channel (left of vertical line) and overbank flows (right of vertical line) with varying degrees of floodplain lateral slope.

coefficient,  $a_{ch}$ , to 0.2 and the value of the exponent,  $b_{ch}$ , was set to 0.4. To maintain continuity from in-channel to overbank flows, the value of the coefficient for overbank flows,  $a_{fp}$ , is a function of the coefficient for in-channel flows, as well as the exponents for both overbank and in-channel flows:

$a_{fp} = a_{ch} Q_{bf}^{(b_{ch} - b_{fp})}$ , where  $Q_{bf}$  is the bankfull discharge. For this analysis,  $Q_{bf}$  was arbitrarily chosen to be  $10 \text{ m}^3/\text{s}$ , consistent with an intermediately sized channel. We vary the value of the overbank flow exponent,  $b_{fp}$ , from 0.1 to 0.3 to test the sensitivity of the analysis to the difference in lateral slope between the channel banks and the floodplain. These at-a-station hydraulic geometry parameter values for overbank flows correspond to those reported for stage-discharge relationships in compound channels elsewhere [Ackers, 1993; Shiono et al., 1999]. We use downstream hydraulic geometry relations to calculate channel width and slope as a function of  $Q_{bf}$  developed from coarse-

bedded streams in the Rocky Mountains, Colorado by *Torrizo and Pitlick* [2004].

The statistical properties of the flow regime must be related to  $Q_{bf}$  in a nonarbitrary manner. That is, the flow regime must “fit” the channel geometry represented by the value of  $Q_{bf}$ . To do this, we used a single log linear regression between mean annual discharge and  $Q_{bf}$  ( $n = 10, R^2 = 0.92$ ) from the streams studied by *Torrizo and Pitlick* [2004]:

$$\mu_x = 0.151 Q_{bf}^{0.873} \quad (7)$$

The relationship between mean daily discharge and  $Q_{bf}$  used in this analysis is unique to the Colorado Rocky Mountains where it was developed. As before, we maintain  $\mu_x$  constant and vary  $C_v$  from 0.5 to 5. We acknowledge that flow regime variability can influence channel form. Varying flow variability while maintaining a constant channel form is a simplification used in this study.

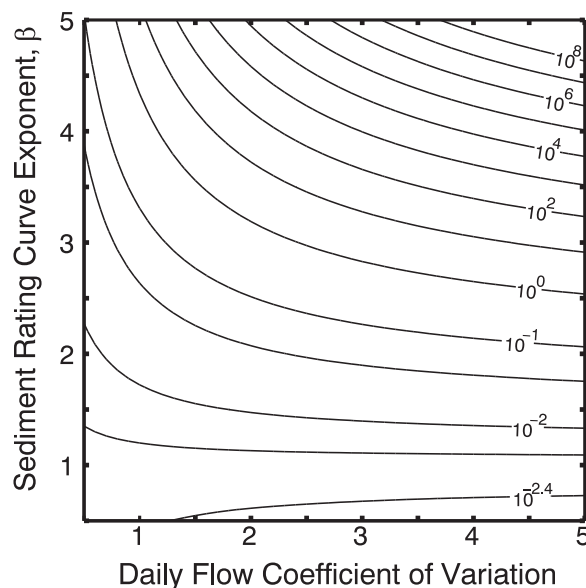
The single power law sediment-rating curve assumes a single stage discharge relationship. To incorporate a compound channel form, we use a simplified, nonsediment entrainment threshold version of the Einstein-Brown (EB) equation as reported in *Brown* [1950] because it has a form similar to a power law sediment-rating curve:

$$Q_s = k_1 \tau_*^3 \quad \tau_* = \frac{hS}{(G-1)D_s} \quad (8)$$

In equation (8),  $k_1$  is a constant coefficient, which converts dimensionless unit width, volumetric sediment flux to total sediment discharge (tonnes/day),  $G$  is the specific gravity of the sediment (set to 2.65), and  $D_s$  is the characteristic sediment diameter. The independent variable in this equation,  $\tau_*$ , is the dimensionless Shields parameter, which is a linear function of depth,  $h$  for wide rectangular channels, and friction slope,  $S$ . Hence, with depth defined as a power law function of discharge, and  $Q_s$  defined as a power law function of  $\tau_*$ ,  $Q_s$  in (8) can now be defined as a power law function of discharge. This is a continuous relationship in the SPL case and a broken or piecewise relationship in the BPL case. Results using (8) can be directly compared to the power law sediment-rating curve of the form  $Q_s = \alpha Q^\beta$  used in theoretical MFA approaches:

$$Q_s = \frac{k_1 a^3 S^3}{[(G-1)D_s]^3} Q^{3b} \quad (9)$$

where  $a$  and  $b$  are equal to  $a_{ch}$  and  $b_{ch}$  for  $Q \leq Q_{bf}$  and equal to  $a_{fp}$  and  $b_{fp}$  for  $Q > Q_{bf}$ . We arbitrarily chose a grain size of 10 mm (medium gravel) for this analysis. Sensitivity analysis demonstrates that magnitude-



**Figure 2.** Return interval (year) of  $Q_{eff}$  for  $\mu_x = 2 \text{ m}^3/\text{s}$  as a function of  $\beta$  and  $C_v$ .

frequency analysis metrics are not sensitive to the grain size using this simplified EB relation. We chose this form of sediment transport relation because it represents the sediment transport-discharge relationship in a nonarbitrary manner and can be directly compared to SPL-based theoretical MFA metrics as shown in equation (9) (Figure 1).

The majority of previous work has found the value of  $Q_{eff}$  to be less than or equal to  $Q_{br}$  in alluvial channels [Pickup and Warner, 1976; Andrews and Nankervis, 1995; Soar and Thorne, 2001] with the exception of Bunte et al. [2013]. In the present analysis,  $Q_{eff}$  was always less than  $Q_{br}$ , therefore the only MFA metric that was affected by the BPL sediment flux-discharge relationship was the fraction of sediment transported above  $Q_{eff}$ ,  $f_+$ . We generate effectiveness curves using finite approximations of the continuous lognormal PDF. To compare values of  $f_+$  for the SPL and BPL scenarios directly, we use the area

under the SPL effectiveness curve as the denominator of  $f_+$ .

### 3.4. Sediment Entrainment Threshold

In section 3.3, we considered the influence of compound channel form on MFA metrics without considering a threshold for sediment entrainment. Here we explore how the presence or absence of a threshold affects the values of MFA metrics compared to those derived by equations (2), (3), and (4). Using the same numerical analysis framework in section 3.3, we introduce a final sediment transport relation that includes a threshold for sediment entrainment: the Meyer-Peter and Müller (MPM) relation for uniformly sized sediment in transport as bed load [Meyer-Peter and Müller, 1948].

$$Q_s = k_2 (\tau_* - \tau_{c*})^{1.5} \quad (10)$$

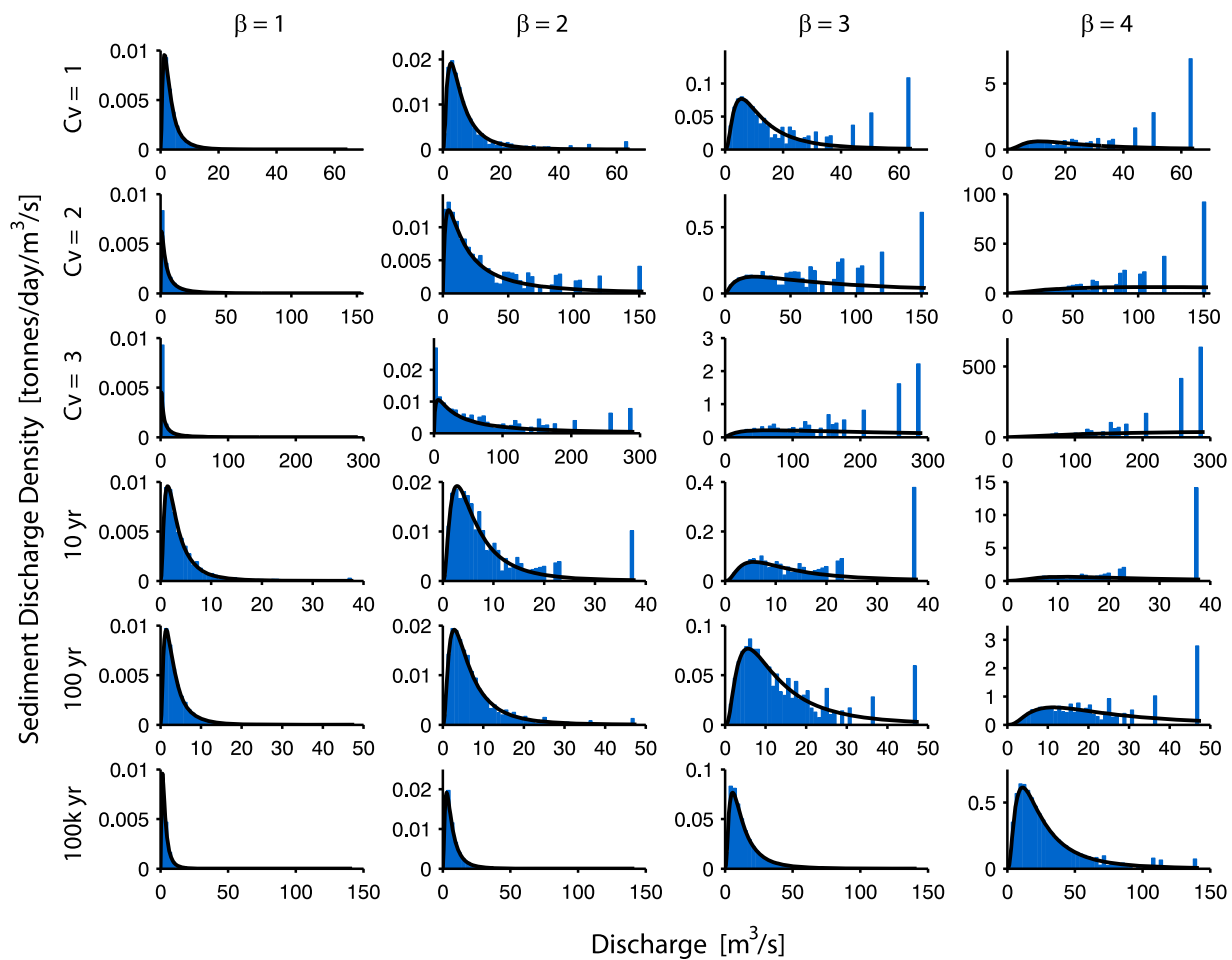
The constant,  $k_2$ , is similar in concept and units to  $k_1$ . Additionally,  $\tau_{c*}$  represents the critical value of dimensionless shear stress for sediment entrainment (set to 0.047). It is a threshold value of dimensionless shear stress below which no sediment transport occurs. We chose MPM because of its parsimony, which serves this illustration of the influence of a threshold of sediment transport on MFA metrics. Similar trends between MFA metrics and  $C_v$  result when a more complex bedload equation is used [e.g., Parker, 1979].

We vary the size of sediment considered from 1 mm (coarse sand) to 64 mm (very coarse gravel), which, for a given channel geometry, increases the flow depth and discharge necessary for sediment entrainment. Using MPM (10), and finite approximations of lognormal PDFs representing daily flows with  $C_v$  values ranging from 0.5 to 5, we generate finite approximations of theoretical effectiveness curves as before. We calculate values of the MFA metrics using MPM rather than a sediment-rating curve with no threshold for sediment transport (e.g., sections 3.1–3.3) and compare these with values from their theoretically derived counterparts.

## 4. Results and Discussion

### 4.1. Flow Regime Analysis

We begin with results from the theoretically derived MFA metrics from equations (2), (3), and (4) coupled with the flow regimes described above fit to lognormal PDFs. The relationship between  $RI$  as a function of  $\beta$  and  $C_v$  indicates that as  $\beta$  increases,  $RI$  increases for constant  $C_v$ , but more so for  $C_v > 2$  (Figure 2). As  $C_v$  increases with constant  $\beta$ ,  $RI$  increases for  $\beta > 2$  (representative of the bed load-dominated domain), and is relatively constant for  $\beta < 2$ .



**Figure 3.** A random sample of effectiveness histograms for a range of  $\beta$  and  $C_v$  values for a 100 year flow record (top three rows) and a range of record lengths for  $C_v = 1$  (bottom three rows) along with theoretical lognormal effectiveness curve (solid black curve). Flow samples are identical moving across columns. Flow samples change moving down rows as  $C_v$  and record length increase. Note that for  $\beta \geq 3$ , the largest discharge bin generally becomes the most effective. This is more apparent for larger values of  $C_v$  and for shorter flow record lengths.

The theoretical relation plotted in Figure 2 precludes the possibility of  $R_I$  approximating the 1.5 year flow event for  $\beta \leq 2.5$ . The 1.5 year event is often cited as the median or average return interval for  $Q_{eff}$  or  $Q_{bf}$  though with questionable merit as discussed by Doyle *et al.* [2007]. While these general trends may translate to physical systems in some cases, the absolute values of  $R_I$  shown in Figure 2 diverge from those reported for North American streams, calculated using empirical methods, which generally fall in the range of 0.5–2 years [Pickup and Warner, 1976; Andrews, 1980; Nash, 1994; Emmett and Wolman, 2001]. However, recent work by Bunte *et al.* [2013] using different bed load measurement techniques suggests that in coarse-bedded streams with very large sediment-rating curve exponents ( $\beta > 5$ ), the largest flows are likely the most effective over time. While this theoretical relation may provide information about the general relationships between sediment transport mode, flow variance, and the magnitude of  $Q_{eff}$ , it is limited in its applicability to the physical world, especially for large  $\beta$  and  $C_v$  values.

As described by equation (4),  $f+$  increases in an asymptotic manner with  $C_v$  and is not a function of  $\beta$  (see section 4.3 for further discussion). As  $C_v$  increases, the flow PDF and effectiveness curve become more positively skewed and the tails heavier. In other words, smaller discharges become more frequent and large discharges become slightly more frequent. This translates to a value of  $Q_{eff}$  that decreases with increasing  $C_v$  in a relative sense. That is,  $Q_{eff}$  occupies an increasingly smaller position of cumulative sediment transport and the area of the effectiveness curve to the left of  $Q_{eff}$  decreases while the value of  $f+$  increases (see section 4.4). In their analysis of sand bed streams, Soar and Thorne [2001] found an increasing relationship between  $f+$  and a metric for flow variance; however, work by Bunte *et al.* [2013] in coarse-bedded streams



suggests otherwise. We explore this divergence in sediment transport and MFA metric behavior between fine and coarse-bed streams in section 4.4, below.

#### 4.2. Flow Record Length Analysis

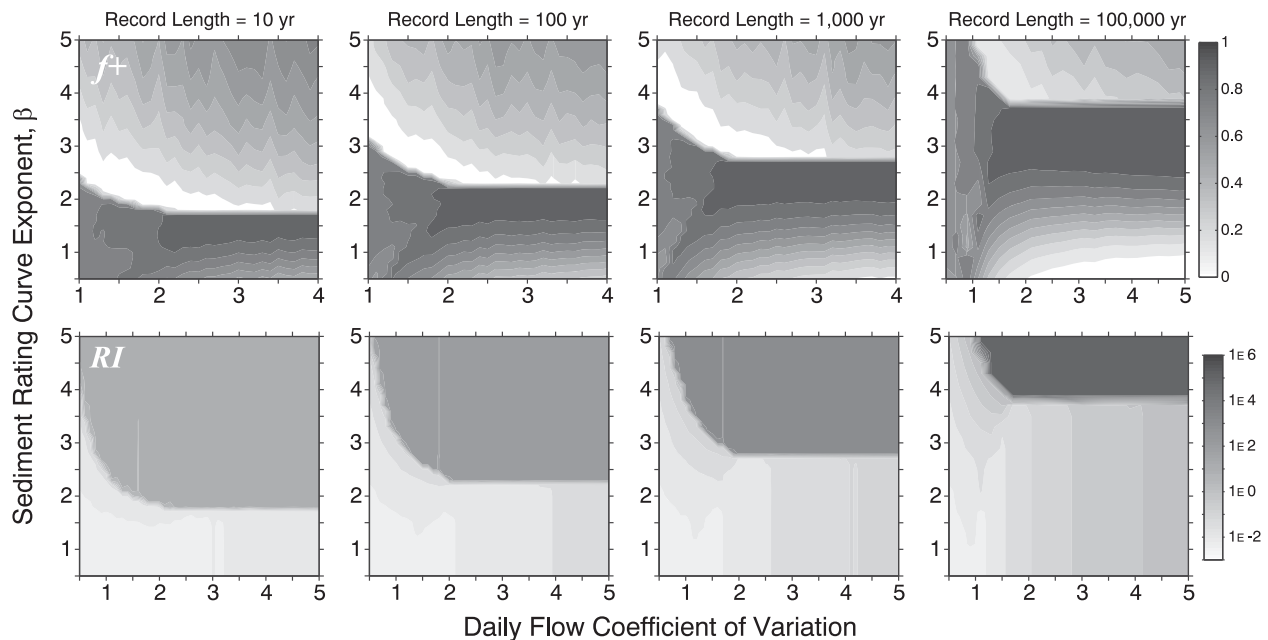
In the previous section, we considered the influence of  $C_v$  on MFA metrics using theoretical approaches alone, which use continuous PDFs to represent daily flows. Here we compare values of MFA metrics generated from theoretical approaches with those generated from synthetic, finite flow records sampled from the same underlying daily flow PDF (empirical approach). We begin this discussion by considering samples of effectiveness histograms representing a range of  $\beta$  and  $C_v$  values and flow record lengths (Figure 3). The effectiveness histograms plotted in Figure 3 (top three rows) represent a single 100 year flow record chosen randomly from the 100 trials conducted for each plotted value of  $C_v$ . As both  $\beta$  and  $C_v$  increase, larger, less frequent flows transport relatively more sediment over time. The effective discharge, or the median value of the flows in the bin with the maximum effectiveness value, tends to fall in the first flow bin for  $C_v > 1$  and  $\beta < 2$ . The effective discharge tends to fall in the last flow bin for  $\beta \geq 3$  over all values of  $C_v$ . At some threshold value of  $\beta$ ,  $Q_{eff}$  jumps from a very frequent flow value to a very infrequent value in the right tail of the effectiveness histogram, sometimes falling in the last flow bin. This jump, or threshold, can be seen in the contour plots of  $f+$  and  $RI$ , plotted as functions of  $\beta$  and  $C_v$  (Figure 4).

The number of years in a flow record also plays a role in the relationships between  $\beta$  and  $C_v$  and the MFA metrics  $f+$  and  $RI$ . Consider effectiveness histograms generated from flow records with  $C_v = 1$  and lengths varying from 10 to 100,000 years (Figure 3, bottom three rows). As the flow record length increases, the synthetic daily flow histogram more closely replicates the continuous function that is the product of the sediment-rating curve and the lognormal flow PDF underlying theoretical MFA approaches. This gives more weight to more frequent flows near the flow distribution peak. Less frequent flows in the tails of the distribution carry more weight in shorter flow records, which have fewer flows in each bin. This effect becomes more pronounced in the effectiveness histograms as the value of  $\beta$  increases for shorter flow records (Figure 3). The effective discharge calculated from shorter flow records is more sensitive to the occurrence of a rare flow event overwhelming sediment yield.

We continue this record length analysis by considering the relationship between MFA metrics  $f+$  (Figure 4 top row) and  $RI$  (Figure 4 bottom row) as a function of  $\beta$  and  $C_v$ . Moving from bottom to top in each subplot in the upper row of Figure 4,  $f+$  increases with  $\beta$  to a maximum value at  $\beta \approx 1.8$  for the 10 year flow record up to  $\beta \approx 3.8$  for the 100,000 year flow record. After this  $\beta$  threshold is reached,  $f+$  drops precipitously to nearly zero when  $Q_{eff}$  falls into the largest discharge bin in the effectiveness histogram (see Figure 3). As  $\beta$  continues to increase, more weight is given to infrequent flows in the right hand tails of the flow probability distribution resulting in more sediment being transported at larger discharges (some greater than  $Q_{eff}$ ) and a slow increase in  $f+$  occurs after this threshold. The threshold described here begins at  $\beta \approx 2.4$  for the 10 year records up to  $\beta > 5$  for the 100,000 year records at  $C_v = 0.5$  and decays to a constant  $\beta \approx 1.8$  to  $3.8$  at  $C_v$  values that range from approximately 2.1 to 1.8 for the 10 years and 100,000 year record lengths, respectively.

The value of  $f+$  is less sensitive to  $C_v$  than to  $\beta$ . In the case of relatively shorter flow records (e.g., 10–100 years), a more sparse distribution of flows allows a few large, infrequent flows to overwhelm the total sediment transport at smaller values of  $\beta$ . In the realm of existing flow record lengths (10–100 years), the behaviors of  $f+$  and  $RI$  as functions of  $\beta$  and  $C_v$  transition smoothly from the values shown in Figure 4 for the 10–100 year plots.

The theoretical relation for  $f+$  described by equation (4) is only a function of  $C_v$  and does not resemble the behavior plotted in Figure 4 (top row). A horizontal line at intermediate values of  $\beta$  (below the threshold) tracks the approximate trend described by equation (4) of  $f+$  increasing asymptotically to unity with increasing  $C_v$ . The difference between the two descriptions of  $f+$  lies in the difference between discrete flow series and flow series represented by continuous PDFs, as well as the definition of  $Q_{eff}$ . Even though the discrete, synthetic flow series generated for this study are derived from the same underlying PDF as equations (2) to (4), they behave differently than continuous PDFs in MFA in large part due to the lack of a continuous right tail in the flow distribution (histogram) of finite records (Figure 3). This lack of continuity in the tail of empirical records of course depends on sample size. Assuming, for example, that a river's flow regime perfectly fits the lognormal distribution, given a long enough period, the discrete flow record will



**Figure 4.** Contour plots of values of the fraction of sediment transported above  $Q_{eff}$  ( $f+$ , top row) as well as the return interval of  $Q_{eff}$  ( $RI$ , bottom row) in years as a function of  $\beta$ ,  $C_v$ , and length of flow record. Contour values represent the median value of  $f+$  (top row) and  $RI$  (bottom row) of 100 trials of each flow record length.

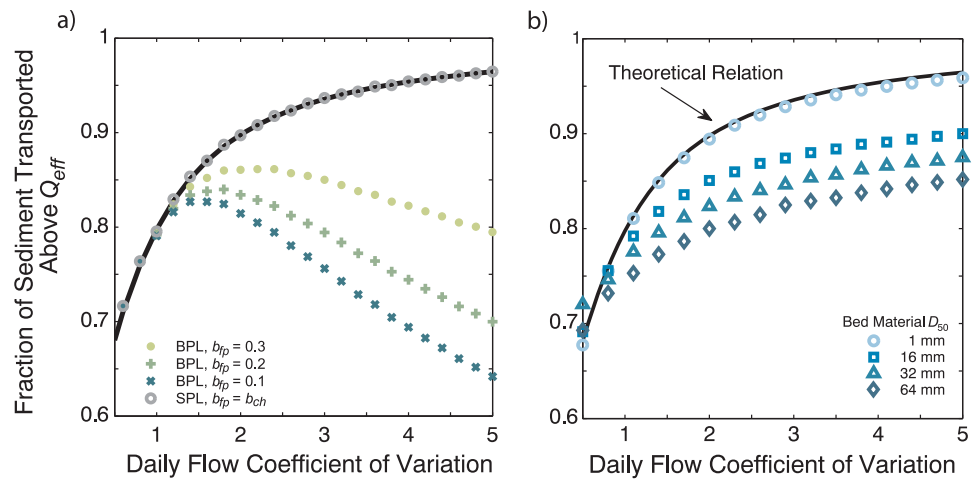
match the continuous distribution. However, over engineering time frames (often 50–100 years), this is likely not the case. The return interval of  $Q_{eff}$  ( $RI$ , calculated with equation (3) for median values of  $Q_{eff}$  from 100 trials) behaves in a similar manner as  $f+$  in terms of the threshold effect in the  $\beta$  direction (Figure 4, bottom row). Here,  $RI$  remains fairly constant with  $\beta$  until the threshold is reached. After which  $RI$  rapidly jumps to a much larger value as  $Q_{eff}$  occurs in the uppermost discharge bins of the effectiveness histograms.

The record length results show that use of a continuous flow PDF inherent in theoretical MFA weights sediment transport to the tails of the flow PDF and overestimates their influence. Theoretical approaches do not capture the variability and sensitivity of MFA to finite flow records, especially for larger  $C_v$  and  $\beta$  values. We find that the need for a longer flow record becomes more important as the variability of the flows increases as well as for values of  $\beta$  greater than approximately 2. This demonstrates that caution should be used when calculating effective discharge in systems with shorter flow records and highly variable flow conditions. For example, one relatively large flow event in the right tail of 10 year flow record is the most effective for  $\beta = 3$  and  $C_v = 1$ . While a very infrequent flow may be the calculated effective discharge, consideration should also be given to the effectiveness peak of the more frequent flows, or a range of flows, when designing a channel for sediment continuity.

#### 4.3. Compound Channel Analysis

Next we consider the influence of compound channel form on MFA by using a sediment-discharge rating curve for two cases: (1) a single power law (SPL) function for all discharge values, and (2) a piecewise or broken power law (BPL) function which incorporates a break in the stage-discharge relationship at  $Q_{bf}$  to simulate overbank flows.

Using the SPL under case 1, a continuously increasing relationship between  $f+$  and  $C_v$  is predicted, which coincides with the theoretical solution for  $f+$  described by equation (4). However, if we assume that shear stress on the channel bed increases at a slower rate with discharge for overbank flows than for in-channel flows, as with the BPL sediment transport relation in case 2, then a decreasing relationship is predicted between  $C_v$  and  $f+$  after a peak in  $f+$  at  $C_v \approx 1.5$ – $2.0$  (Figure 5a). The location of this peak depends on the degree of difference between channel bank slope and floodplain lateral slope. As the value of  $b_{fp}$  decreases the lateral floodplain

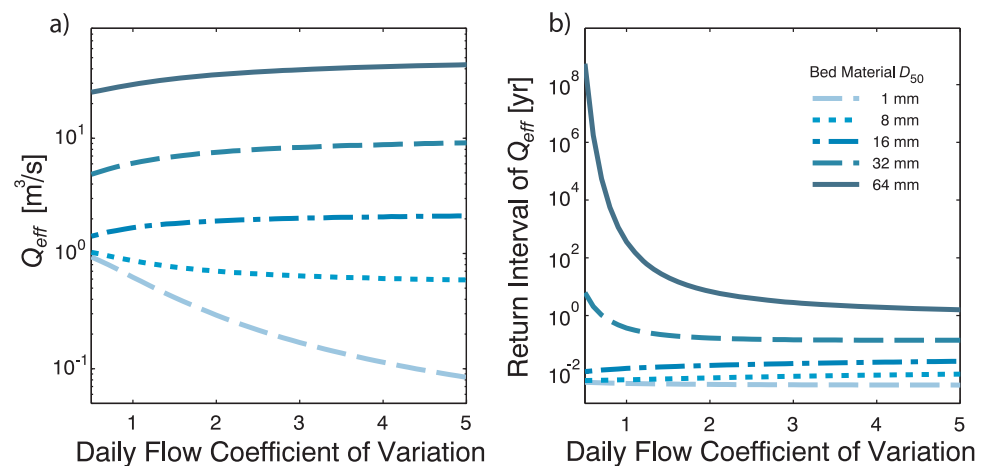


**Figure 5.** (a) The fraction of sediment transported by discharges greater than  $Q_{eff} f+$ , for the single power law (SPL) and broken power law (BPL) at-a-station hydraulic geometry relationships. (b) Values of  $f+$  for a range of grain sizes in a noncompound channel using an entrainment threshold for sediment transport.

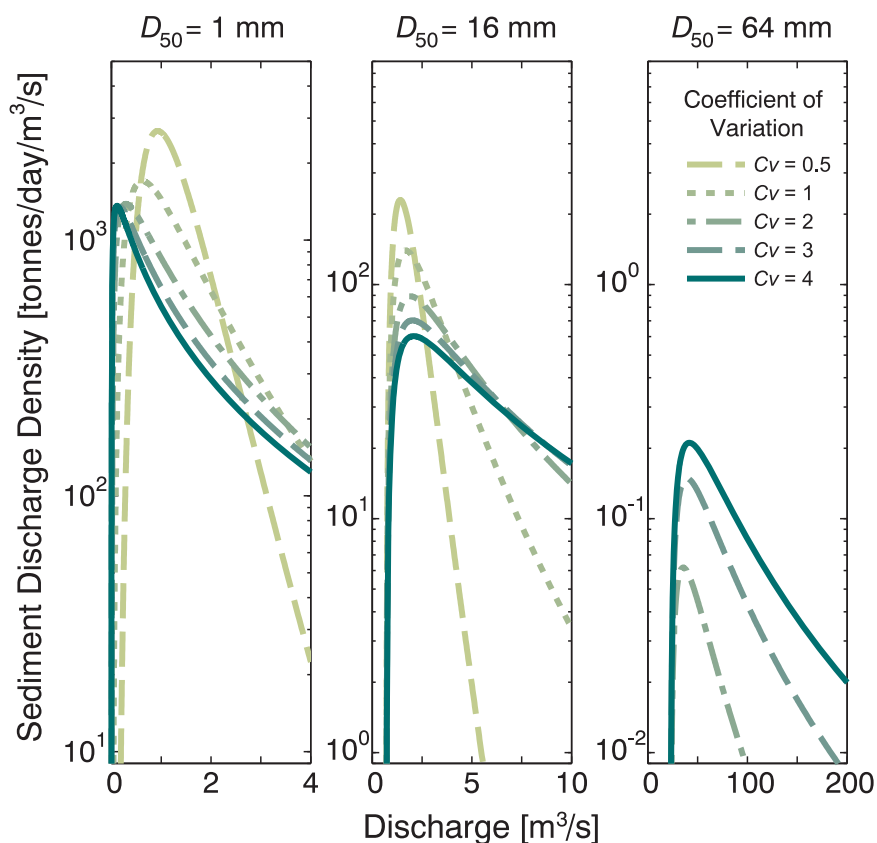
slope becomes milder relative to the channel bank slope, and the amount of sediment transported at a given overbank discharge decreases. This reduces the relative influence of larger, infrequent flows.

In case 1,  $Q_{eff}$  reduces in absolute magnitude with increasing  $C_v$  resulting in more sediment being transported at flows greater than  $Q_{eff}$  and an increase in  $f+$ . In case 2,  $Q_{eff}$  behaves the same way with  $C_v$  since it is less than  $Q_{bf}$  where the break in at-a-station overbank hydraulic geometry occurs. For a given value of  $C_v$ ,  $f+$  is smaller in case 2 than in case 1 because less sediment is transported overall by overbank flows. The fraction of sediment transported above  $Q_{eff}$  continues to decline with increasing  $C_v$  in case 2 as overbank floods become more frequent, but less effective when compared to case 1. This relationship may change if a threshold for sediment transport is introduced, which is explored by itself in the next section.

It is often the case that breaks in stage-discharge relationships are not explicitly incorporated in MFA [e.g., Andrews, 1980; Nash, 1994]. However, as Hey [1996], and others studying the hydraulics of compound channels [e.g., Knight and Demetriou, 1983] note, single stage-discharge or stage-shear stress relationships may not accurately capture the hydraulics of natural rivers with floodplains. Of course, the question of capacity-limited sediment transport at large flows is more complex than treated herein. For example, fine sediment-limited systems can develop armor layers [Dietrich et al., 1989], which can lead to discontinuous flow-sediment transport relationships before and after armor layer breakup [Bathurst, 1987]. Nevertheless, this



**Figure 6.** (a) The value of  $Q_{eff}$  as a function of  $C_v$  and sediment grain size,  $D_{50}$ . (b) The return interval of  $Q_{eff}$  in years as a function of the same. Note that the  $Q_{eff} - C_v$  relationship decreases for relatively small sediment (sand to fine gravel) but increases for large sediment sizes (medium gravel to small cobble).



**Figure 7.** Effectiveness curves for a range of grain sizes and  $C_v$  values. Note that the discharge associated with the peaks of these curves,  $Q_{eff}$ , decreases with increasing  $C_v$  for small grain sizes and increases with increasing  $C_v$  for large grain sizes.

simple computational experiment has demonstrated that explicitly incorporating floodplain morphology and overbank flows can substantially influence calculations of the magnitude and frequency of sediment transport in natural rivers. We have shown that flow variability interacts with floodplains to reduce the influence of large infrequent flows on long-term sediment transport in channels.

#### 4.4. Sediment Entrainment Threshold Analysis

The final element of physical context we introduce to the theoretical MFA approach is a threshold for sediment entrainment. Sediment transport operating with a threshold interacts with flow distributions in ways that depart from the simplistic sediment-rating curve. For distributions with low  $C_v$ , large flows are relatively rare. Transport of coarse sediment classes—and the most effective discharge for these sediment size classes—occur primarily in the right tail of the flow distribution resulting in a very large  $RI$  (Figure 6b). With increasing  $C_v$ , flows less than the threshold for sediment entrainment become more frequent pushing the bulk of sediment transport further out into the right tail of the flow distribution and increasing the absolute value of  $Q_{eff}$  (Figure 6a). However, as  $C_v$  increases in coarse-bedded rivers,  $RI$  drops precipitously with increasing  $C_v$  as the larger flows necessary to move coarser sediment become more common (Figure 6b). In contrast, in fine grain streams with very low or negligible entrainment thresholds the peak of the effectiveness curve follows that of the flow distribution as  $C_v$  increases. This means that the absolute value of  $Q_{eff}$  decreases with increasing  $C_v$  (Figures 6a and 6b; Figure 7, left). This reverse in the relationship between  $C_v$  and  $Q_{eff}$  between coarse and fine sediment can be seen by examining the peak of effectiveness curves for a range of sediment sizes and  $C_v$  values (Figure 7).

We find a reduction in  $f+$  as a function of  $C_v$  for values generated with the threshold-type sediment transport relation compared to what equation (4) predicts (Figure 5b). This difference increases with grain size. The threshold for fine-grained sediment (1–8 mm in this example) is relatively small and the sediment transport relation for this size class approximates the single power law, sediment-rating curve used in equation

(4). Therefore, the  $f+ - C_v$  relationship for sand size material (1 mm) approximates the theoretical relation (equation (4)). However, as sediment size increases ( $\geq 1$  mm in this example), the  $f+ - C_v$  relationship increasingly falls below the theoretical relation, though parallels its shape. This is due to the  $Q_{eff} - C_v$  relationship previously discussed: as  $C_v$  increases more flows occur below the threshold of entrainment for coarser sediment resulting in less sediment transport overall. This combination of effects results in increasingly smaller values of  $f+$  as grain size and  $C_v$  increase.

The divergence in trends in absolute value of  $Q_{eff}$  and  $C_v$  between streams with fine versus coarse sediment has been documented in these stream types separately in the literature. Work by *Bunte et al.* [2013] in bed load-dominated gravel and cobble streams suggests that as flow variance increases so does  $Q_{eff}$  such that for certain large values of flow variance,  $Q_{eff}$  may be the largest discharge on record (assuming that sediment is never supply limited in these streams). In sand bed streams dominated by suspended load, *Soar et al.* [2005] found a decreasing relationship between the ratio  $Q_{eff}/Q_{bf}$  and flow variance using a different metric of flow variance:  $Q_2/Q_{mean}$ , where  $Q_2$  is the 2 year flood based on the maximum annual flood series and  $Q_{mean}$  is the mean annual discharge. Here we present a physical mechanism for this diverging relationship across sediment size classes due to the relationship between flow variability and the magnitude and frequency of flows greater than the threshold for sediment entrainment.

## 5. Conclusions

Magnitude-frequency analysis (MFA) conducted with theoretical, closed-form equations (2), (3), and (4) provides valuable insight about the general relationships between sediment transport mode, flow variance, and the magnitude of the effective discharge,  $Q_{eff}$ , to generate hypotheses about the physical world. However, these theoretical approaches fall short of capturing important physical processes and complexities inherent in rivers and streams, and may not apply to actual river management scenarios, which have finite time horizons. In this study, we have used simple numerical experiments to test the validity of theoretical MFA approaches in predicting the magnitude and frequency of sediment transport. We have also used the analytical framework implicit in these approaches to study the influence of compound channel form and a threshold for sediment entrainment on the magnitude and frequency of sediment transport.

Theoretical MFA relations predict a monotonic increase in the absolute value, as well as the return interval ( $RI$ ), of the effective discharge,  $Q_{eff}$ , with increasing flow coefficient of variation,  $C_v$ , and sediment-rating curve exponent,  $\beta$  using equations (2) and (3) (Figure 2). The fraction of sediment transported by discharges greater than  $Q_{eff}$ ,  $f+$ , as predicted by equation (4), monotonically increases with  $C_v$  and approaches unity asymptotically for large values of  $C_v$  (Figure 5, solid line).

In this study, we demonstrate that even modest modifications to the assumptions contained in these theoretical approaches result in divergent relationships among flow variance, sediment transport mode, and values of MFA metrics. We find the following:

1. Median values of MFA metrics  $RI$  and  $f+$  from finite flow records sampled from the same continuous flow probability density function used in the theoretical MFA relations demonstrate complex, nonmonotonic, and threshold-driven relationships as a function of  $C_v$ ,  $\beta$ , and the length of the flow record (Figure 4) not reflected in the theoretical relations for these metrics.
2. Introducing compound channel morphology by creating a break in the stage-discharge relationship at the bankfull discharge causes the  $f+ - C_v$  relationship to fall well below that predicted by equation (4). The value of  $f+$  increases up to an intermediate value of  $C_v$  and then decreases for larger values of  $C_v$  (Figure 5a). This outcome is due to the reduction in effectiveness of overbank flows with the existence of a floodplain. It is sensitive to the difference between channel bank slope and floodplain lateral slope.
3. Inclusion of a threshold for sediment entrainment results in a divergent relationship between  $Q_{eff}$  and  $C_v$  between fine and coarse-grain channels. In channels with fine-grained sediment, the absolute value of  $Q_{eff}$  decreases with increasing  $C_v$  while the value of  $f+$  follows equation (4) closely. In channels with coarse-grained sediment and larger entrainment thresholds, the absolute value of  $Q_{eff}$  increases with  $C_v$  and the value of  $f+$  falls below that predicted by equation (4) (Figures 5b, 6, and 7).

This divergence in the  $Q_{eff} - C_v$  relationship for fine versus coarse sediment has been observed separately in coarse-bed [*Bunte et al.*, 2013] and fine-bed streams [*Soar et al.*, 2005]. As the flow distribution becomes

more positively skewed with increasing  $C_v$  smaller flows become more frequent resulting in  $Q_{eff}$  reducing with  $C_v$  in fine-grained streams with low sediment entrainment thresholds. In coarse-grained streams, these more frequent small flows associated with larger  $C_v$  fall below the entrainment threshold. Flows in the tails of the distribution then dominate sediment transport and, because the flow PDF tail thickens with increasing  $C_v$ ,  $Q_{eff}$  also increases.

Magnitude-frequency analysis of sediment transport in rivers provides a process-based, analytical tool for river scientists and managers to characterize what flow or range of flows is most responsible for transporting sediment and maintaining sediment continuity in a channel. These approaches may be applied practically (e.g., channel design and environmental flow studies) and academically (e.g., dynamic equilibrium theory). Our study indicates that the empirical approach to MFA, which is based on a finite flow record, should be relied on for practical questions with engineering time horizons (50–100 years). However, in applying the empirical approach to systems with shorter flow records ( $\leq 10$  years) that have larger  $C_v$  values and/or  $\beta$  values ( $\geq 2$ ), a few large flows can overwhelm MFA resulting in very large estimates of  $Q_{eff}$ . Depending on the question of interest, this result may or may not be appropriate to consider in the long-term sediment yield of a river.

Theoretical MFA approaches are useful for predicting general relationships between aspects of the flow regime, sediment transport mode, and sediment yield in research settings. We found that their assumptions limit their use primarily to cases where sediment entrainment thresholds are nonexistent or are very small (e.g., wash or dissolved load) when a sediment rating curve is utilized, where compound channel form is lacking, or where only in-channel flows are considered. The values and behaviors of metrics based on integrals of continuous and infinite PDFs such as  $f+$  diverge from those generated from discrete and finite records in large part due to the lack of a continuous right tail in the flow distribution of finite records (Figure 3). This lack of continuity in the right tail of empirical records is of course a phenomenon of sample size. This study indicates that use of a continuous theoretical flow PDF over weights sediment transport in the tails and overestimates their influence under engineering time-frames (often 50–100 years) when compared to empirical distributions of finite flow records.

Future work will more closely consider the interaction between channel form, flow regime, and sediment transport mode. The behavior of MFA metrics using different probability distributions other than the two-parameter lognormal distribution as well as the use of bed load versus total load sediment transport equations will be considered. These and other metrics generated from MFA have the potential to inform general geomorphic theory as well as process-based channel design.

## Notation

$a$	coefficient for at-a-station hydraulic geometry relation. Subscripts “ $ch$ ” and “ $fp$ ” denote in-channel and overbank or floodplain values, respectively.
$\alpha$	coefficient for sediment transport rating curve.
$\beta$	exponent for sediment transport rating curve.
$b$	exponent for at-a-station hydraulic geometry relation. Subscripts “ $ch$ ” and “ $fp$ ” denote in-channel and overbank or floodplain values, respectively.
$C_v$	coefficient of variation of daily flows.
$D_s$	sediment grain size (m). Subscript “50” denotes the median grain size value.
$f+$	fraction of sediment transported by discharges greater than the effective discharge.
$k$	sediment transport relation coefficient.
$\mu$	mean of untransformed ( $\mu_x$ ) and log-transformed ( $\mu_y$ ) daily flows.
$\sigma$	standard deviation of untransformed ( $\sigma_x$ ) and log-transformed ( $\sigma_y$ ) daily flows.
$\Phi$	cumulative normal distribution function.
$Q$	discharge rate, $m^3/s$ .
$Q_s$	sediment discharge rate, tonnes/day.
$Q_{bf}$	bankfull discharge, $m^3/s$ .
$Q_{eff}$	effective discharge, $m^3/s$ .
$RI$	return interval of a discharge value, year.
$RL$	flow record length, year.
$\tau^*$	Shields dimensionless shear stress. Subscript “ $c$ ” denotes critical value for sediment entrainment.

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