Metapopulation persistence and species spread in river networks

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Abstract

River networks define ecological corridors characterized by unidirectional streamflow, which may impose downstream drift to aquatic organisms or affect their movement. Animals and plants manage to persist in riverine ecosystems, though, which in fact harbor high biological diversity. Here we study metapopulation persistence in river networks analyzing stage-structured populations that exploit different dispersal pathways, both along-stream and overland. Using stability analysis we derive a novel criterion for metapopulation persistence in arbitrarily complex landscapes described as spatial networks. We show how dendritic geometry and overland dispersal can promote population persistence, and that their synergism provides an explanation for the so-called 'drift paradox'. We also study the geography of the initial spread of a species and place it in the context of biological invasions. Applications concerning the persistence of stream salamanders in the Shenandoah river, and the spread of two invasive species in the Mississippi-Missouri are also discussed.

1 Introduction

Population persistence in riverine streams represents a long-standing issue in freshwater ecology (Speirs & Gurney, 2001; Lutscher et al., 2010). These ecosystems are in fact characterized by strong unidirectional water flow, which imposes downstream drift to the movement of aquatic organisms. In the absence of mechanisms allowing for upstream colonization, the persistence of riverine populations would hardly be possible. This 'drift paradox' is especially relevant to non-sessile organisms with low self-propelled motion capacity, such as the larval stages typical of many freshwater species. To explain the long-term persistence of such populations several mechanisms have been proposed. As first empirically documented by Müller (1954) in Scandinavian freshwater ecosystems, many insect species compensate larval drift with upstream-directed flight of adults prior to oviposition (Müller's colonization

cycle; see Müller, 1982). As an alternative explanation, Waters (1972) proposed an excess production hypothesis, in which drifting organisms are supposed to be those who exceed the balance of numbers at the local scale (thus implicitly assuming that drift represents an extra-mortality term). Also, hydrodynamic stream heterogeneities have been shown to cause organism retention in hydrodynamic in-flow refugia (e.g. Reynolds *et al.*, 1991; Lancaster & Hildrew, 1993a,b).

The passive movement of an aquatic organism in a river system mainly results from the 32 combination of advection, as determined by the dominant uniform streamflow, and diffu-33 sion, as determined by local streamflow heterogeneities. Active movement, occurring via swimming, crawling or flying (either directly or through some dispersal vector) further increases macroscopic diffusion – in some cases becoming the predominant source of motion. These factors act within a distinctive landscape topology, usually characterized by a hier-37 archical branching geometry endowed with universal scaling features (Rodriguez-Iturbe & Rinaldo, 1997). Riverine ecosystems are in fact among the most representative examples of dendritic ecological networks (Peterson et al., 2013). Diffusive dispersal (Speirs & Gurney, 2001; Pachepsky et al., 2005) and river network topology (Fagan, 2002; Campbell Grant, 2011) have been recently proposed as key factors for the persistence of riverine populations. Topology is particularly important in constraining the dispersal of aquatic species lacking life stages that can disperse overland (Fagan, 2002). This mode of dispersal has been both theoretically postulated (Lutscher et al., 2005) and experimentally observed (Carrara et al., 2012) to facilitate the persistence of riverine populations. Dispersal can occur at different life stages, most frequently early in the life history of aquatic organisms. As an example, in a massive mark-recapture study (Campbell Grant et al., 2010) of two lungless salamander species in stream networks of Virginia, the newly metamorphosed (juvenile) salamanders had the highest probabilities of dispersing to other stream reaches, thus being the primary responsible for overland connections. While it is relatively common to find freshwater organisms that begin their life cycle as motile and reach maturity as sessile (e.g. mussels), there
are notable exceptions – as in the case of parasites with complex life cycles that involve
intermediate hosts with low motility (e.g. snails) and final hosts with high motility (e.g.
fish; see Blasco-Costa et al., 2012).

Despite their importance, diffusive dispersal, landscape geometry, stage-dependent move-56 ment and exploitation of multiple dispersal pathways have not yet been analyzed together to 57 yield a comprehensive description of the conditions leading to the persistence and spread of 58 riverine populations. Classical approaches in fact include the analysis of reaction-advectiondiffusion (Speirs & Gurney, 2001; Pachepsky et al., 2005), integro-differential (Lutscher et al., 2005) or integro-difference equations (Lutscher et al., 2010) in simple one-dimensional (1-D) landscapes. Dendritic geometries have been considered in simulation studies of individual-62 based models (Fagan, 2002; Campbell Grant, 2011) and in matrix population models applied to stage-structured populations in networks of habitat patches (Goldberg et al., 2010). This study is particularly interesting because it is devoted to the analysis of branching spatial structure and life history on the asymptotic growth rate of a riverine population – with clear implications for population persistence. Also, some analytical results for the persistence of a population subject to advection and diffusion on a tree graph have been provided recently by Ramirez (2012).

Here, we use stability analysis to derive a spatially explicit persistence criterion for riverine metapopulations. A technically similar approach has recently been used in an epidemiological context to determine invasion thresholds for pathogens of waterborne diseases (Gatto
et al., 2012, 2013). We analyze a model network for a riverine metapopulation with two
developmental stages (juveniles and adults) in which individuals are allowed to move according to multiple stage-dependent dispersal pathways, typically along the hydrological
network and overland. We use the criterion to study the effects of contrasting geometries
and different ecohydrological conditions on metapopulation persistence. We also analyze a

case study pertaining the persistence of a metapopulation of stream salamanders inhabiting
the Shenandoah river (Virginia, US). As the conditions for metapopulation persistence in a
river ecosystem correspond to those for species spread, we discuss how to use our framework
in the context of biological invasions, for which the analysis of dispersal pathways is crucial
to focusing mitigation and conservation efforts. To that end, we study retrospectively two
recent biological invasions of a large fluvial system (namely, the spread of the zebra mussel
and of the Asian carp in the Mississippi-Missouri river system, MMRS).

$_{ iny 85}$ 2 Material and methods

86 The model

We consider a prototypical aquatic metapopulation living in a river network made of n nodes (Fig. 1a), each of which represents a river stretch where local ecological conditions are identical. We assume that the species has two ecologically distinct developmental stages, thus we split the population in young (non-reproductive) individuals (Y) and adult (reproductive) individuals (A). Movement from node to node can occur through different pathways, either along the stream network or overland. Local demographic processes (birth, growth and death) and dispersal dynamics in each node i of the river network are described by the following system of 2n ordinary differential equations

$$\frac{dY_i}{dt} = -\mathcal{M}_Y(Y_i, A_i)Y_i - \gamma Y_i + \mathcal{N}(Y_i, A_i)A_i - \sum_{h=1}^{N_Y} l_h \left(Y_i - \sum_{j=1}^n P_{hji}Y_j\right)$$

$$\frac{dA_i}{dt} = -\mathcal{M}_A(Y_i, A_i)A_i + \gamma Y_i - \sum_{k=1}^{N_A} m_k \left(A_i - \sum_{j=1}^n Q_{kji}A_j\right), \tag{1}$$

where: $\mathcal{M}_Y(Y_i, A_i)$ [$\mathcal{M}_A(Y_i, A_i)$] is the (possibly) density-dependent per-capita mortality rate for juveniles [adults]; γ is the rate at which young individuals become adult $(1/\gamma)$ thus being

the average duration of the juvenile phase); $\mathcal{N}(Y_i, A_i)$ is the (possibly) density-dependent natality rate of adults; l_h [m_k] is the rate at which young [adult] organisms undergo disper-98 sal along to the h-th [k-th] pathway ($h = 1..N_Y$ [$k = 1..N_A$] being the number of possible 99 dispersal mechanisms for juveniles [adults]); and P_{hji} [Q_{kji}] is the fraction of young [adult] or-100 ganisms moving from node j to node i through the h-th [k-th] dispersal mechanism available 101 to juveniles [adults]. We assume that the mortality [natality] rate is a monotonically increas-102 ing [decreasing] function of population density $(\partial \mathcal{M}_{Y,A}/\partial(Y_i,A_i)\geq 0, \, \partial \mathcal{N}/\partial(Y_i,A_i)\leq 0$ for 103 any i), i.e. that there is no depensation or Allee effect. Note that the assumption of spatial 104 homogeneity of the parameters can be relaxed, and that the model can also be easily ex-105 tended to describe populations with more complex age/stage structures. A comprehensive 106 list of mathematical symbol is reported in Table 1. 107

Figure 1 and Table 1 about here

109 Connectivity structures and dispersal mechanisms

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Dispersal probabilities P_{hji} and Q_{kji} depend on the connectivity structure provided by the 110 environmental matrix and the dispersal mechanisms relevant to the metapopulation being 111 investigated. As for connectivity, we consider three hypothetical network structures for 112 theoretical analyses and two real river networks (the Shenandoah river and the MMRS) 113 for more realistic case studies. The hypothetical networks considered here are a 1-D lattice 114 (Fig. 1b), a deterministic fractal, namely a Peano construct (Fig. 1c) and a so-called Optimal 115 Channel Network (OCN, Fig. 1d; Rodriguez-Iturbe & Rinaldo, 1997). While the lattice 116 geometry clearly represents an oversimplification of real river networks (although widely 117 used to study population persistence in riverine ecosystems; see e.g. Speirs & Gurney, 2001; 118 Lutscher et al., 2005), Peano's topological measures match closely those of real river networks. OCNs represent a further step forward, in that their topological and metric properties are virtually undistinguishable from those of real river networks.

As for dispersal pathways, the first and foremost mechanism to be considered in a riverine 122 setting is along-stream aquatic dispersal, which may describe both hydrological drift and 123 active movement along river corridors (see Appendix S1 in Supporting Information). Other 124 mechanisms can be relevant to the dispersal of riverine populations as well. For instance, 125 flying or human/animal-mediated transport processes (Wilson et al., 2009) could be only 126 partially constrained by river network geometry and flow direction (see e.g. Collier & Smith, 127 1998; Didham et al., 2012, for empirical evidence concerning insect flight), thus potentially 128 providing aquatic organisms with suitable pathways for unbiased overland dispersal. This 129 can be described by e.g. an exponential kernel (Hanski & Ovaskainen, 2000), but other, 130 possibly ad hoc, mechanisms can obviously be introduced to describe dispersal in species-131 specific case studies. 132

Dispersal probabilities are subsumed into connection matrices, namely $\mathbf{P_h} = [P_{hij}]$ and $\mathbf{Q_k} = [Q_{kij}]$. We assume that $\sum_{j=1}^n P_{hij} \leq 1$ and $\sum_{j=1}^n Q_{kij} \leq 1$ for any i, h and k. Specifically, row-wise sums can be less than one in the presence of absorbing boundary conditions (see again Appendix S1) and/or costly dispersal (Casagrandi & Gatto, 1999), which both imply the non-conservation of the abundance of dispersing organisms. Finally, the union of the graphs associated with the matrices $\mathbf{P_h}$ and $\mathbf{Q_k}$ is assumed to be strongly connected, so that it is always possible for the individuals of the focal species to find a path between any two nodes of the river network via the available dispersal pathways.

Derivation of persistence conditions

Irrespectively of parameter values, the state $\mathbf{X_0}$ characterized by $Y_i = 0$ and $A_i = 0$ for any i is a global extinction equilibrium for model (1). In the absence of an Allee effect, metapopulation persistence is related to the stability of this equilibrium. In fact, if $\mathbf{X_0}$ is stable the population cannot persist in any of the river network nodes. On the contrary, if

 $\mathbf{X_0}$ is unstable, juvenile and adult abundances, even if initially small, are expected to grow thus granting metapopulation persistence. The condition for the extinction equilibrium to switch from stable to unstable is that the Jacobian matrix \mathbf{J} of system (1) linearized at $\mathbf{X_0}$ has one zero eigenvalue. Population persistence can thus be assessed by analyzing how the eigenvalues of \mathbf{J} vary with model parameters, connectivity structures and dispersal mechanisms.

Spatial patterns of species spread

In our framework, the condition under which a species can invade a river network corre-153 sponds to that for metapopulation persistence. As such, if the global extinction equilibrium 154 is unstable, the dominant eigenvector of matrix **J** pinpoints the direction in the state space 155 along which the system trajectories, after a transient period due to initial conditions, will 156 diverge from the equilibrium. Specifically, the components of the leading eigenvector cor-157 respond to the evolving abundances of young or adult individuals in different locations of 158 the river network. The analysis of the dominant eigenvector of the Jacobian of system (1) 159 evaluated at $\mathbf{X_0}$ is thus key to understanding the early spatial patterns of species spread, 160 and can thus be useful – at least from a qualitative perspective – to study the geography of 161 aquatic invasions in riverine ecosystems. 162

3 Results

A spatially explicit persistence criterion

As detaild in Appendix S2, the stability switch of the extinction equilibrium corresponds to the condition $\det(\mathbf{I_n} - \mathbf{J^*}) = 0$, where $\mathbf{J^*}$ is a matrix of size n, deducible from the 2n-sized

Jacobian \mathbf{J} of (1), defined as

$$\mathbf{J}^{\star} = R_{0}\mathbf{I}_{\mathbf{n}} + \frac{1}{\mu_{Y} + \gamma} \sum_{h=1}^{N_{Y}} l_{h} \left(\mathbf{P}_{\mathbf{h}}^{T} - \mathbf{I}_{\mathbf{n}}\right) + \frac{1}{\mu_{A}} \sum_{k=1}^{N_{A}} m_{k} \left(\mathbf{Q}_{\mathbf{k}}^{T} - \mathbf{I}_{\mathbf{n}}\right) + \frac{1}{\mu_{A}(\mu_{Y} + \gamma)} \sum_{h=1}^{N_{Y}} l_{h} \left(\mathbf{P}_{\mathbf{h}}^{T} - \mathbf{I}_{\mathbf{n}}\right) \sum_{k=1}^{N_{A}} m_{k} \left(\mathbf{Q}_{\mathbf{k}}^{T} - \mathbf{I}_{\mathbf{n}}\right).$$

$$(2)$$

In the previous expression, $R_0 = \nu \gamma / \mu_A / (\mu_Y + \gamma)$ is the quantity controlling population persistence in a non-spatial setting and can be interpreted as the average number of daughters 166 successfully reaching maturity generated by one mother during her entire lifetime. The 167 condition for an isolated population to persist is thus $R_0 > 1$. In the presence of dispersal, 168 instead, metapopulation persistence is determined by the dominant eigenvalue $\lambda_{max}(\mathbf{J}^{\star})$. 169 Specifically, the persistence-extinction boundary (i.e. the curve or surface in the system 170 parameter space that separates parameter combinations corresponding to metapopulation 171 extinction from those corresponding to persistence; Casagrandi & Gatto, 1999) is given by 172 the condition 173

$$E_0 = \lambda_{max}(\mathbf{J}^*) > 1. \tag{3}$$

In other words, the occasional introduction of some individuals in some network nodes results in a successful colonization if (and only if) $E_0 > 1$. In this case, the assumption of strong connectivity made above implies that persistence is granted in all the network nodes.

Criterion (3), shows that not only local demographic processes (first term in the righthand side of eq. (2)), but also average net immigration from connected sites (second and
third terms) is relevant to the persistence of riverine metapopulations. It also shows that the
intertwining between different dispersal pathways may have nontrivial effects on metapopulation persistence or extinction (last term in the right-hand side of eq. (2)). As a matter
of fact, the persistence condition is based on the dominant eigenvalue of J^* , which is not
simply deducible from R_0 and the eigenvalues of matrices P_h and Q_k . Note that, close to the

persistence-extinction boundary, E_0 also sets a timescale for metapopulation dynamics and, in particular, for metapopulation extinction (see again Appendix S2). Criterion (3) can be extended to account for spatial heterogeneities in the model parameters whenever relevant for the underlying ecological processes (Appendix S3).

188 The role of network structure and dispersal pathways

As a basic test case to study persistence in a river network, we have analyzed a population in 189 which adults are sessile and juveniles are subject to drift/operate along-stream dispersal $(l_1 >$ 190 $0, l_h = 0$ for any $h > 1, m_k = 0$ for any $k, \mathbf{P_1} = \mathbf{F}$, with \mathbf{F} being the hydrological connection 191 matrix; see Appendix S1). Fig. 2a (gray lines) shows that high values of along-stream 192 dispersal and bias are always detrimental to species persistence, and that network topology 193 remarkably influences the fate of the metapopulation. Specifically, more complex networks (Peano, OCN) favor metapopulation persistence compared to simpler geometries (lattice) 195 with the same backbone length. Quite interestingly, the largest relative differences emerging 196 from the three contrasting topologies are found for high dispersal rates and low values of 197 the transport bias. In these conditions, along-stream movement is significantly influenced 198 by geomorphological dispersion, i.e. by the intertwining of hydrodynamic dispersion within 199 individual reaches and the morphology of the network structure (Rinaldo et al., 1991). 200

Figure 2 about here

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Changes in the flow regime can obviously affect the persistence of metapopulation dispersing through water pathways. Fig. 2b (gray lines) shows that the metapopulations that cannot
compensate higher bias of aquatic dispersal with higher natality are doomed to extinction
- i.e. that downstream drift reduces metapopulation capacity (sensu Hanski & Ovaskainen,
205 2002). Close to the persistence-extinction boundary the dynamics of the metapopulation
is very slow, because $E_0 \approx 1$ (and $\lambda_{max}(\mathbf{J}) \approx 0$). Therefore, extinctions may occur over

long (yet still ecological) timescales depending on the distance from the bifurcation curve characterized by $E_0 = 1$. This delay generates an extinction debt (*sensu* Tilman *et al.*, 1994). As an example, the model predicts extinction for all the parameter settings lying below the persistence-extinction boundaries in Fig. 2b – yet in the light-gray-shaded regions metapopulation extinction will take more than 10 years, approximately corresponding to 10 generation times for the population under study (see again Appendix S2).

To analyze how different dispersal pathways can influence metapopulation persistence, 214 we have studied populations in which juveniles disperse not only along the hydrological 215 network but also overland $(l_1 > 0, l_2 > 0, l_h = 0 \text{ for any } h > 2, m_k = 0 \text{ for any } k,$ 216 $\mathbf{P_1} = \mathbf{F}, \, \mathbf{P_2} = \mathbf{G}$, with \mathbf{G} being the connection matrix describing overland isotropic dispersal 217 with characteristic dispersal length D; see Appendix S1). Figs. 2a and 2b (black lines) 218 show that overland dispersal can remarkably benefit riverine metapopulation persistence. 219 in particular for high values of the bias of along-stream dispersal. Under these conditions, 220 corresponding in fact to advection-dominated environments, overland dispersal can provide 221 riverine populations with an effective mean of upstream propagation, thus mitigating the 222 downstream drift imposed to offspring and juveniles by passive hydrological transport. These 223 results hold qualitatively for all the considered network topologies (not necessarily riverine; see Appendix S4 for some examples of 2-D lattice geometries). However, it is apparent that 225 topological complexity and the multiplicity of dispersal pathways operate synergistically (last 226 term in eq. (2)), thus greatly favoring the persistence of metapopulation inhabiting complex 227 river networks (Fig. 2c). The effects of this synergism are very robust not only to changes 228 of the demographic rates, but also to variations in the exploitation of different dispersal 229 pathways in relation to specific life histories (Appendix S5). 230

One might wonder whether enhanced persistence due to the superimposition of different dispersal pathways is simply due to higher overall (i.e. along-stream + overland) dispersal.

We have thus repeated some of the analyses above considering different dispersal strategies,

defined as the combination of overland and aquatic dispersal operated by a population. Specifically, we assume that a fraction ϕ of the total movement rate K is allocated to overland 235 movement, while the remaining fraction $1-\phi$ is allocated to water-mediated dispersal. 236 Fig. 2d reports a systematic exploration of the parameter space (K, ϕ) , each point of which 237 represents a different dispersal strategy, and shows that even relatively small fractions of 238 total movement rate allocated to overland dispersal are sufficient to guarantee persistence. 239 The exploitation of alternative dispersal pathways (specifically, of overland dispersal) can 240 thus remarkably affect the fate of a population subject to downstream drift in a riverine 241 ecosystem. 242

Persistence of an amphibian metapopulation in a river system

The framework presented above can be adapted to study the persistence of a real metapopulation in a river network. As a proof of concept, here we study the fate of a metapopulation 245 of stream salamanders in the Shenandoah river network (Virginia, US; Fig. 3a). Model (1) 246 has been parameterized with demographic (Organ, 1961) and dispersal (Campbell Grant 247 et al., 2010) data relative to the salamander species Desmognathus fuscus and D. monti-248 cola (technical details in Appendix S6). The juveniles of these two amphibian species can 249 move both along stream corridors and overland, while larvae and adults are almost sessile. 250 Quite interestingly, juveniles' along-stream dispersal is known to be biased towards upstream 251 sites in the river network. Despite the ongoing decline of amphibian abundances worldwide, 252 populations of stream salamanders in Eastern North America are reportedly stable – an 253 observation that has been linked to their ability to exploit multiple dispersal pathways (see 254 again Campbell Grant et al., 2010). 255 Our analysis shows that if the cost of dispersal (here defined as the fraction of individuals 256 that disperse outside their suitable habitat) is negligible, both along-stream (low ϵ_s) and

overland (low ϵ_o), then the salamander metapopulation is predicted to persist ($E_0 \gg 1$).

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However, for increasing values of the cost of dispersal (possibly due to the alteration of the habitat template), the metapopulation can cross the persistence-extinction boundary, and 260 can thus be doomed to extinction (Fig. 3b). It is also possible to test the sensitivity of E_0 261 to changes of the model parameters. Besides expected positive [negative] effects of increased 262 natality ν [mortality μ_Y and μ_A] on E_0 , increasing levels of overland dispersal l_2 can promote 263 metapopulation persistence (as suggested by Campbell Grant et al., 2010), provided that the 264 cost of overland movement is lower than that of along-stream dispersal. E_0 can actually peak 265 for intermediate values of the overland dispersal rate (as in Fig. 3c), a result that mirrors the 266 intermediate dispersal principle of metapopulation ecology (e.g. Casagrandi & Gatto, 1999, 267 2006). 268

Figure 3 about here

²⁷⁰ The geography of riverine biological invasions

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The dominant eigenvector of the linearized model nearby extinction is a synthetic spatial 271 indicator of the initial spread of a riverine population, not only in theoretical settings (as in 272 Appendix S7) but also in real applications, as it turns out by adapting model (1) to qual-273 itatively describe two paradigmatic examples of biological invasion recorded in the MMRS 274 (Fig. 4a). Here we report the results for the first example only (the zebra mussel colonization 275 of the MMRS; technical details in Appendix S8), while the second example (the Asian carp 276 invasion of the MMRS) is discussed in Appendix S9. 277 The zebra mussel (*Dreissena polymorpha*), a freshwater bivalve native to Eurasia, invaded 278

the Great Lakes region in the late 1980's and rapidly spread across North America inland waters (e.g. Strayer, 2009, see also panels b and c of Fig. 4). The main vectors of species dispersal during the early phase of the invasion were hydrological transport of larvae (the so-called 'veligers') and long-distance port-to-port veliger dispersal because of inland com-

mercial navigation (Mari *et al.*, 2011). The veligers may in fact be shipped within the ballast water of commercial vessels, thus allowing the species to disperse over very long distances and to colonize stretches of the river network that could not have been reached otherwise.

Figure 4 about here

We have parameterized model (1) to describe zebra mussel invasion dynamics (Casagrandi 287 et al., 2007; Mari et al., 2009, 2011), namely by considering sessile adults and a juvenile stage 288 during which veligers can undergo dispersal through hydrological transport and port-to-port 289 relocation (described by a port-to-port connectivity matrix Γ with characteristic dispersal 290 distance Δ ; see Appendix S8). The resulting value of $E_0 \gg 1$ implies that the zebra mussel 291 can persist and spread in the MMRS (as indeed observed; note that a high value of E_0 292 corresponds to a great risk of invasion). The dominant eigenvector of the linearized model 293 computed under these hypotheses turns out to be a satisfactory qualitative indicator of the 294 risk of mussel spread in the early phase of the invasion (Fig. 4d). Interestingly, the dominant 295 eigenvector of matrix J correctly predicts the widespread occurrence of zebra mussel colonies throughout the MMRS, not only in the Upper and Lower Mississippi, but also in the lower 297 course of the Missouri river, as well as in the Ohio river – i.e. in the rivers where most of the largest MMRS commercial ports are located (see also Fig. 2a in Mari et al., 2011). 299 Numerical experiments suggest that the dominant eigenvector of matrix J is also rather a 300 robust descriptor of the spatial patterns of early population spread, even in the presence of 301 non-negligible uncertainty in the model parameters (see again Appendix S7). 302

303 4 Discussion

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In this work we have proposed a novel way to determine conditions for population persistence and spread in a river network. Our study has shown that metapopulation persistence is

determined by complex interactions between network geometry and dispersal mechanisms – among which along-stream movement plays a prominent role in fluvial settings. In particular, 307 we have shown that a dendritic geometry does enhance metapopulation persistence in a river 308 network. This result echoes recent theoretical and experimental findings that have linked 309 dendritic topologies to long species persistence times and high local biodiversity (e.g. when 310 compared to 2-D landscapes; Bertuzzo et al., 2011; Carrara et al., 2012; Suweis et al., 2012; 311 Altermatt, 2013). Our work has also formally confirmed that overland dispersal can favor 312 metapopulation persistence, especially (but not only) for species subject to hydrological 313 drift. Moreover, extra-range dispersal, i.e. the movement of organisms from the current 314 range to a new area of suitable habitat (e.g. Wilson et al., 2009), is expected to influence 315 both metapopulation persistence and spatiotemporal invasion patterns, as indeed found in 316 the zebra mussel invasion of the MMRS. We can thus conclude that diffusive dispersal, 317 landscape geometry, and exploitation of multiple dispersal pathways may offer a multifaceted 318 solution of the 'drift paradox' for riverine populations. More in general, our work shows that 319 these ingredients are key to understanding metapopulation persistence in realistic (or even 320 real) landscapes. 321

Although derived in the context of river systems, the persistence criterion proposed in 322 this work can be adapted to populations living in different ecosystems, possibly characterized by high levels of spatial complexity. As an example, an interesting application would be the analysis of 2-D lattice geometries, which would allow to address the study of per-325 sistence conditions for terrestrial metapopulations. Preliminary explorations (Appendix S4) 326 confirm that, also in 2-D lattices, metapopulation persistence is deeply related to the con-327 nectivity of the underlying environmental matrix, as well as to the dispersal mechanisms 328 relevant to the metapopulation. The flexibility of our tools is essentially granted by the 329 multi-layer network framework (Mari et al., 2011), which generalizes previous network-based 330 approaches in metapopulation ecology (e.g. Hanski & Ovaskainen, 2000) and allows a hier-

archical description of the interactions between ecological and spatial dynamics at different level of organizational complexity. In addition, our mathematical framework can be readily 333 applied to real case studies whenever there is sufficient information on the focal species to: i) 334 formalize a demographic model for its local-scale dynamics; ii) identify the underlying envi-335 ronmental matrix constituting its habitat (such as river stretches in a fluvial system, patches 336 in a fragmented forest, etc.); iii) sort out its main dispersal pathways (e.g. Appendices 6, 337 8 and 9). In the absence of detailed information on the dynamics of the focal population 338 (which is often the case for endangered species), scaling relations could assist in the defini-339 tion of its demographic parameters (Marquet et al., 2005). The model can then guide the 340 analysis of persistence conditions for metapopulations living in realistic ecosystems, possibly 341 subject to habitat alterations. 342

Human activities represent a main driver for such alterations. Damming, for instance, 343 is usually cited as a primary threat to the integrity of riverine habitats (see e.g. Allan & 344 Castillo, 2007). From an ecological perspective, one of the main effects of damming (in 345 addition to changes of water quality and assemblage composition) is that of reducing along-346 stream dispersal and migration, especially in the upstream direction. This would in turn entail a highly biased hydrological dispersal. Our analysis has shown that increasing bias could reduce metapopulation capacity (Hanski & Ovaskainen, 2002), i.e. it could doom to extinction species that rely on aquatic dispersal and that cannot compensate higher drift 350 with higher natality. In contrast, species that can disperse overland at some specific life 351 stage are predicted to be more resilient to environmental changes, such as alterations of the 352 flow regime or habitat fragmentation. Extinction debts and average times to metapopulation 353 extinction (also known as relaxation times; see e.g. Tilman et al., 1994; Hanski & Ovaskainen, 354 2002; Kuussaari et al., 2009; Hylander & Ehrlén, 2013) can also be quantified through the 355 analysis of persistence-extinction boundaries. 356

The presented framework could obviously be made even more realistic in many respects.

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In its present form, for instance, it does not account for the possible temporal variability of the environmental conditions which, however, has already been proposed – along with spatial 359 heterogeneity – as an important factor for population persistence in advective environments 360 (e.g. Speirs & Gurney, 2001; Lutscher et al., 2006; Lutscher & Seo, 2011). Incorporating 361 spatial heterogeneity in the model parameters is relatively straightforward and does bear 362 major changes to our derivation of persistence conditions – although the algebra required is 363 rather involved (Appendix S3). On the contrary, adding seasonal variability would demand 364 a considerably more elaborated mathematical treatment, possibly relying on Floquet (e.g. 365 Klausmeier, 2008) or Lyapunov exponents (e.g. Ferrière & Gatto, 1995). Another aspect 366 that certainly deserves future investigations is demographic stochasticity, that has already 367 been shown to play an important role for metapopulations dynamics close to the extinction 368 threshold (e.g. Casagrandi & Gatto, 1999, 2006). 369

Despite its limitations, the theoretical framework used to derive persistence conditions 370 (i.e. the stability analysis of an ordinary differential equation network model) can be applied 371 to study other ecological problems. We envisage that similar persistence criteria could in 372 fact be usefully applied to design natural reserves aimed at preserving ecologically important 373 species, as already proposed for marine protected areas (White et al., 2010; Aiken & Navarrete, 2011) and fragmented landscapes (Hanski & Ovaskainen, 2000). In these cases, too, metapopulation persistence can be established by properly accounting for the relevant spatial 376 interactions and studying the conditions under which the extinction equilibrium changes its 377 stability properties. Eigenvector analysis could then assist in designing spatially-calibrated 378 conservation efforts. In an even broader perspective, extending our framework to interacting 379 functional groups would allow to study persistence of aquatic metacommunities (rather than 380 metapopulations). With functional diversity being tightly related to ecosystem functioning 381 and services (Naeem et al., 2012), achieving a better understanding of how we can preserve 382 it through suitably targeted actions would certainly represent a major accomplishment for 384 current conservation ecology.

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553 Tables

Table 1: Mathematical symbols used in the text and their definitions.

| Symbol | Definition |
|----------------------|---|
| | State variables |
| Y_{i} | Abundance of juveniles in node i |
| A_i | Abundance of adults in node i |
| | Network geometry |
| n | Number of nodes in the network |
| n_b | Number of nodes in the network backbone |
| L_b | Length of the network backbone |
| | Demographic parameters |
| \mathcal{M}_Y | Density-dependent mortality rate of juveniles |
| μ_Y | Mortality rate of adults at low population density |
| \mathcal{M}_A | Density-dependent mortality rate of adults |
| μ_A | Mortality rate of adults at low population density |
| \mathcal{N} | Density-dependent natality rate |
| ν | Natality rate at low population density |
| γ | Rate at which juveniles reach maturity |
| | Dispersal parameters |
| N_Y | Number of dispersal pathways available to juveniles |
| l_h | Dispersal rate of juveniles along the h -th pathway |
| $\mathbf{P_h}$ | Connectivity matrix for the h-th juveniles' dispersal pathway |
| N_A | Number of dispersal pathways available to adult individuals |
| m_k | Dispersal rate of adults along the k-th pathway |
| $\mathbf{Q_k}$ | Connectivity matrix for the k-th adults' dispersal pathway |
| | Persistence criterion |
| $\mathbf{X_0}$ | Extinction equilibrium |
| $\mathbf{I_n}$ | Identity matrix of size n |
| R_0 | Reproduction number |
| J | Jacobian matrix of size $2n$ associated with model (1) (Appendix S2) |
| \mathbf{J}^{\star} | Matrix of size n deducible from \mathbf{J} (Appendix S2) |
| E_0 | Dominant eigenvalue of matrix J^* (Appendix S2) |
| | Figure 2 |
| l_1 | Juveniles' along-stream dispersal rate |
| ${f F}$ | Hydrological connectivity matrix (Appendix S1) |
| b | Bias of along-stream dispersal (Appendix S1) |
| l_2 | Juveniles' overland dispersal rate |
| \mathbf{G} | Connectivity matrix for overland dispersal (Appendix S1) |
| D | Average distance of the overland dispersal kernel (Appendix S1) |
| K | Total movement rate |
| ϕ | Fraction of the total movement rate allocated to overland dispersal |
| | Case studies |
| ${f N}$ | Connectivity matrix for salamanders' overland dispersal (Appendix S6) |
| ϵ_s | Cost of salamanders' along-stream dispersal (Appendix S6) |
| ϵ_o | Cost of salamanders' overland dispersal (Appendix S6) |
| Γ | Port-to-port veligers' connectivity matrix (Appendix S8) |
| Δ | Average distance of veligers' port-to-port dispersal (Appendix S8) |
| | |

Figure legends

Figure 1. Schematic representation of the model metapopulation and theoretical river networks used in numerical analyses. (a) A hypothetical sketch of our multi-layer network model (1); hydrological connections (in the example involving juveniles only) are in light gray, while overland connections (in the example adults only) are represented as dashed arrows. (b-d) Different river network topologies; the backbone of each hydrological network has the same number of nodes ($n_b = 33$) and the same arbitrary length ($L_b = 33$) independently of topology, and is indicated by the white-filled nodes (the southmost node being the network outlet).

Figure 2. Persistence conditions for populations with sessile adults and juveniles dispersing 563 via water and overland. Metapopulation persists for parameter combinations below (a) [above (b-d)] the persistence-extinction boundaries ($E_0 = 1$ contour lines, gray and black 565 curves). All rates in year⁻¹. (a) Effect of aquatic dispersal parameters without (gray, $l_2 = 0$) 566 [with (black, $l_2 = 5$)] overland dispersal. (b) Effect of transport and demographic parameters 567 in an OCN without (gray) [with (black)] overland dispersal; gray-shaded areas indicate 568 extinction debts longer than 10 years. (c) Effect of overland dispersal parameters ($l_1 = 400$, 569 b=0.9). (d) Effect of dispersal strategies ($l_1=(1-\phi)K,\,b=0.8,\,l_2=\phi K,$ with $K=l_1+l_2$). 570 Other parameters: $\nu = 25$, $\gamma = 1$, $\mu_A = 1$, $\mu_Y = 5$, $\mathbf{P_1} = \mathbf{F}$, $\mathbf{P_2} = \mathbf{G}$, D = 0.1, $l_h = 0$ for 571 any h > 2, $m_k = 0$ for any k. 572

Figure 3. Persistence of stream salamanders in the Shenandoah river network (Virginia, US). (a) River network geometry; inset: Desmognathus monticola (from USGS). (b) Effect of dispersal cost on population persistence. (c) Sensitivity of E_0 to variations of the model parameters. Parameters: $\nu = 3.9$ juveniles adult⁻¹ year⁻¹, $\gamma = 0.25$, $\mu_Y = 0.40$, $\mu_A = 0.92$, $l_1 = 1.58$, $\mathbf{P_1} = \mathbf{F}$, b = -0.49, $l_2 = 1.04$, $\mathbf{P_2} = \mathbf{N}$, $l_h = 0$ for h > 2, $m_k = 0$ for any k. All rates in year⁻¹. See Appendix S6 for details on the parameterization of the model.

Figure 4. Zebra mussel invasion of the MMRS. (a) River network geometry and localization in the conterminous USA. (b) Fraction of hydrological units (DTAs) invaded by D. polymorpha (inset, from USGS). (c) Spatial occurrence of zebra mussels during the initial phase of the invasion (red in b). (d) Normalized components (adult individuals) of the dominant eigenvector of \mathbf{J} . Parameters: $\nu = 10^6$ larvae adult⁻¹ year⁻¹, $\gamma = 26$, $\mu_Y = 120$, $\mu_A = 0.33$, $l_1 = 180$, $\mathbf{P_1} = \mathbf{F}$, b = 0.8, $l_2 = 3.6$, $\mathbf{P_2} = \mathbf{\Gamma}$, $\Delta = 0.2$, $l_h = 0$ for h > 2, $m_k = 0$ for any k.
All rates in year⁻¹. Parameters have been chosen to reproduce the basic timescales of zebra mussels' lifecycle (Appendix S8).

Figures 587

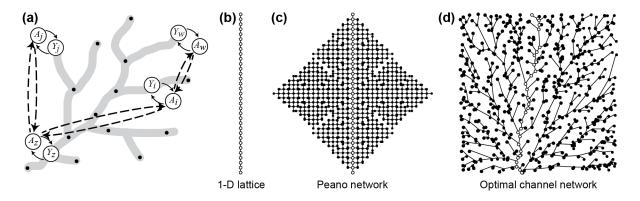


Figure 1:

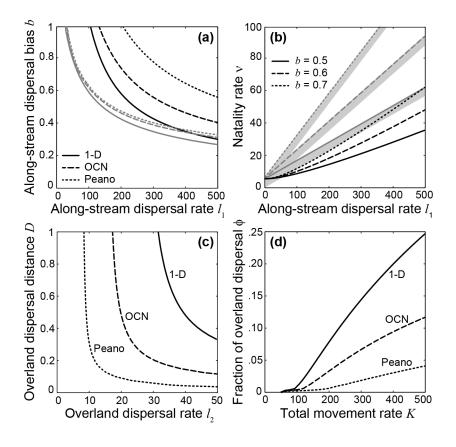


Figure 2:

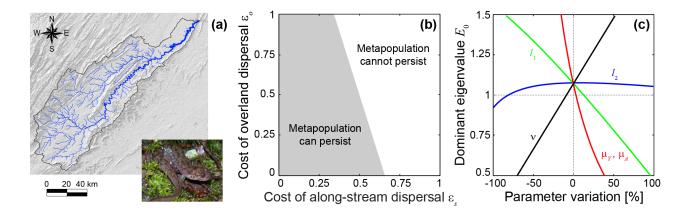


Figure 3:

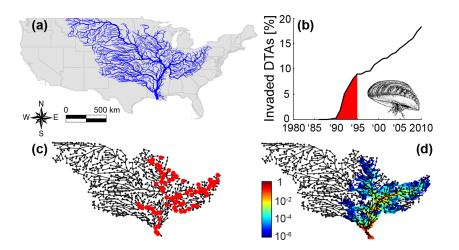


Figure 4: