

A branching particle system as a model of FKPP fronts

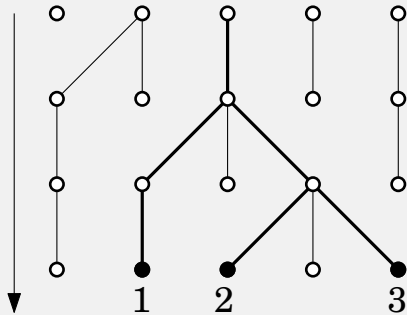
Julie TOURNIAIRE

Laboratoire de Mathématiques de Besançon

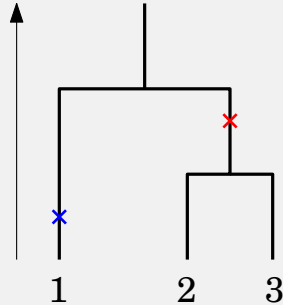
POPULATION GENETICS

GOAL: Unravel the complex genetic patterns that surround us

The genealogical approach



Population model



Genealogical structure

| | | | | | | |
|------------|---|---|---|---|---|---|
| Sequence 1 | A | T | C | C | T | T |
| Sequence 2 | A | C | C | C | T | A |
| Sequence 3 | A | C | C | C | T | A |

DNA sequence alignment

MOLECULAR CLOCK ASSUMPTION:

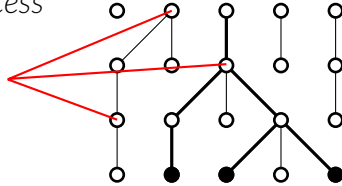
Genealogical structure \Leftrightarrow Genetic structure

POPULATION GENETICS

Genetics in exchangeable (or neutral, unstructured) populations

equal chance of reproductive success

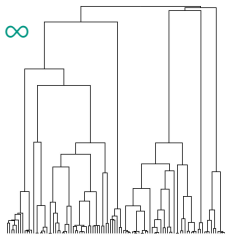
individuals are **exchangeable**



Universality class of genealogies: **exchangeable coalescents**

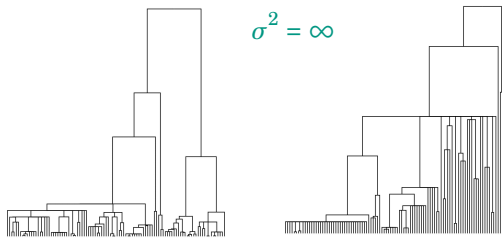
Λ -coalescents (non-simultaneous mergers)

$$\sigma^2 < \infty$$



Kingman

$$\sigma^2 = \infty$$



Beta

Bolthausen-Sznitman

skewed offspring distribution \rightarrow

Rich mathematical structure

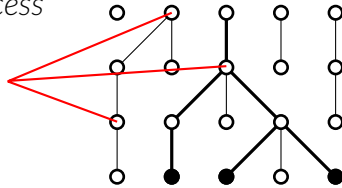
- × Characterisation (Pitman, Sagitov '99)
- × Statistics (e.g. SFS)
- × Data (e.g. Steinruecken *et al.* '13)

POPULATION GENETICS

Genetics in exchangeable (or neutral, unstructured) populations

equal chance of reproductive success

individuals are **exchangeable**



× no selection

× no spatial structure

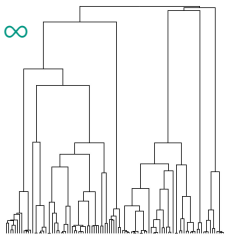
× no demography

⚠ **Key evolutionary forces**

Universality class of genealogies: **exchangeable coalescents**

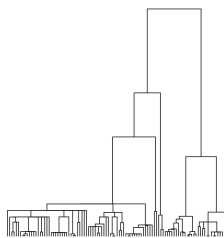
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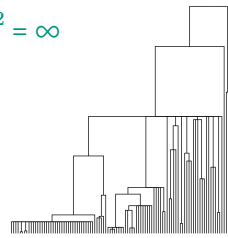


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POPULATION GENETICS

Genetics in exchangeable (or neutral, unstructured) populations

equal chance of reproductive success

≠ structured populations

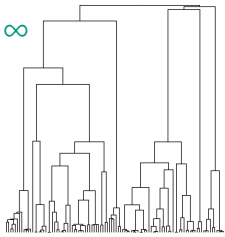
*each type has a different ability to reproduce: **structured coal. ?***



Universality class of genealogies: **exchangeable coalescents**

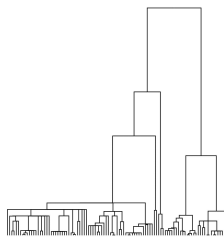
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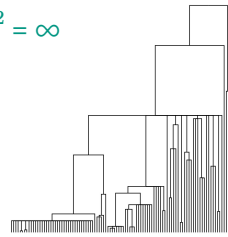


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POPULATION GENETICS

Genetics in exchangeable (or neutral, unstructured) populations

Universality beyond exchangeable models ?

Kingman (WF)

Effective population size
Charlesworth '09

Λ -coalescents

× expanding populations

× natural selection

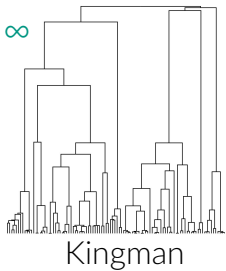
Schweinsberg '17

Etheridge Pennington '22

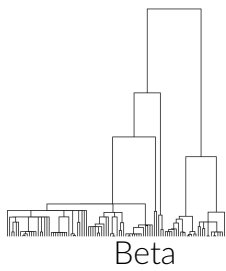
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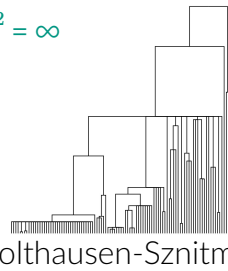
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Bolthausen-Sznitman



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F-KPP fronts with cooperation/Allee effects

Macroscopic dynamic

local regulation

$$\partial_t u = \frac{1}{2} \partial_{xx} u + \frac{1}{2} u \overbrace{(1-u)}^{\text{local regulation}} \underbrace{(1+Bu)}_{\text{cooperation}}$$

$B > 0$ strength of cooperation

$u(t, x)$ = density of individuals at x at time $t > 0$

F-KPP fronts with cooperation/Allee effects

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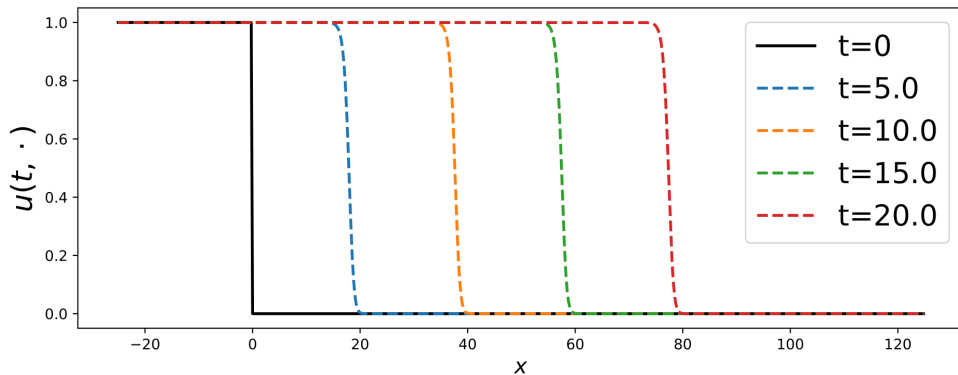
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Travelling wave solutions

constant profile ϕ travelling
at constant speed $v \equiv v(B)$

$$u(t, x) = \phi(x - vt)$$



F-KPP fronts with cooperation/Allee effects

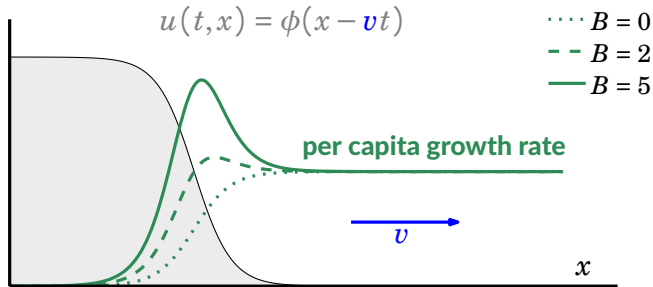
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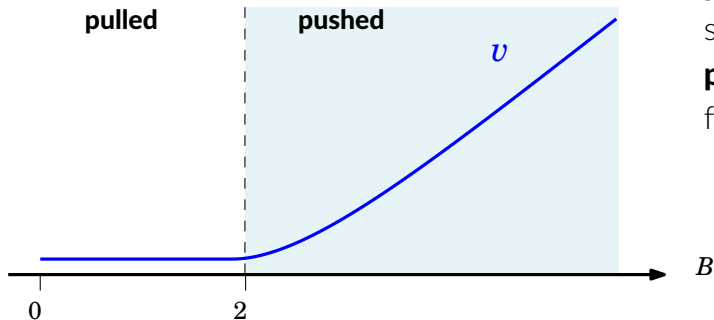
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Two types of waves Stokes '76



pulled

speed of the linearised equation ($u \approx 0$)

pushed

faster than the linearised equation

$$v(B) = \begin{cases} 1 & B \in [0, 2] \\ \frac{1}{2} \sqrt{\frac{B}{2}} \left(1 + \frac{2}{B}\right) & B \geq 2 \end{cases}$$

F-KPP fronts with cooperation/Allee effects

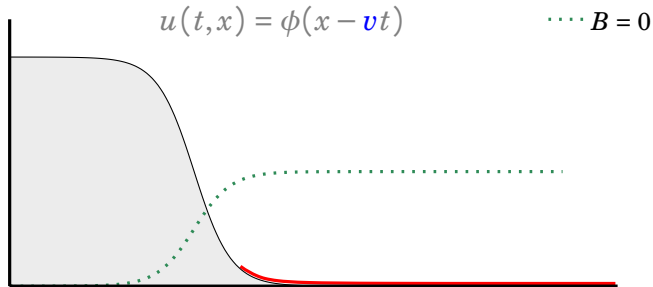
Macroscopic dynamic

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$B > 0$ strength of cooperation

$u(t, x)$ = density of individuals at x at time $t > 0$



The case $B = 0$ (pulled waves)

physical (1) and **evolutionary** properties (2) are prescribed by the dynamics at the very tip of the front. They are '**pulled**' by the individuals at the tip'.

simulations, conjectures and heuristics Brunet *et al.* '97, '06, '06, '07, '08

(1) Fluctuations of the invasion front

$$v - v_N \sim \frac{c}{\log(N)^2}$$

Mueller, Mytnik, Quastel '10

Bérard, Gouéré '12 Maillard '16

(2) Genealogy = Bolthausen-Sznitman

proved for a linear toy model

(no interaction)

Berestycki, Berestycki, Schweinsberg, '13

F-KPP fronts with cooperation/Allee effects

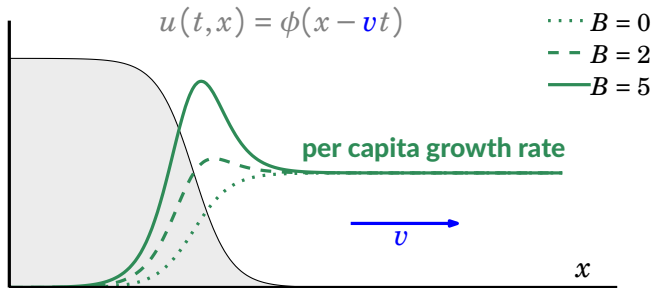
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Recent breakthrough: conjectures by Birzu, Hallatschek, Korolev '18

simulations: Wright-Fisher model with 2 neutral types and vacancies

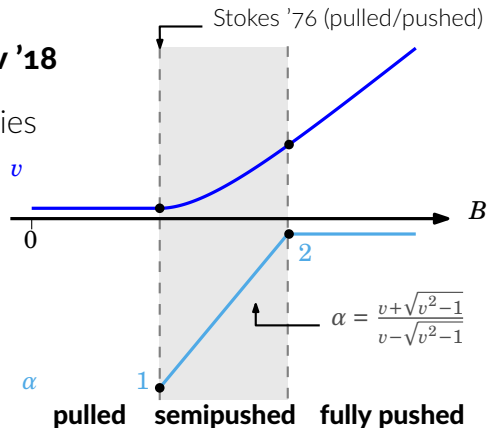
N = local density of individuals

↳ genetic drift ?

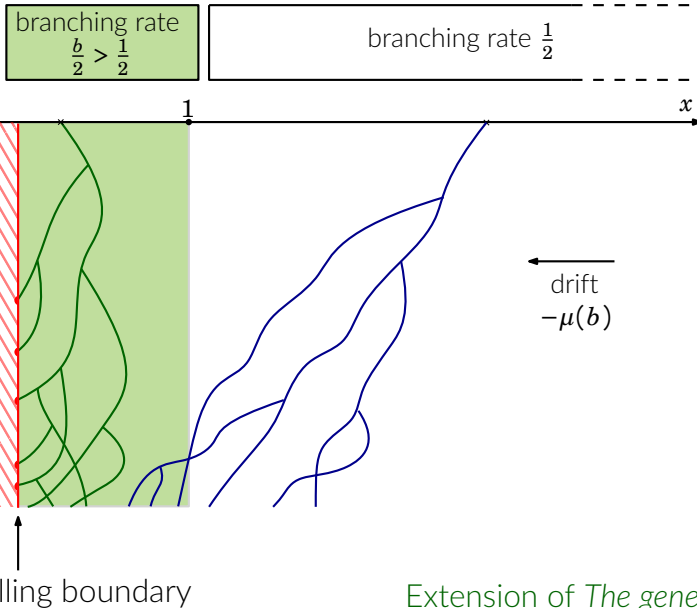
Heterozigosity

= proba. to sample 2 types at the tip

$$p_H(t) = e^{-\Lambda t}, \quad \Lambda = \begin{cases} \ln^{-3} N & B \in [0, 2) \\ N^{1-\alpha} & B \in (2, 4] \\ N^{-1} & B \geq 4 \end{cases}$$



A toy model to investigate the phase diagram



Dyadic branching Brownian motion with branching rate

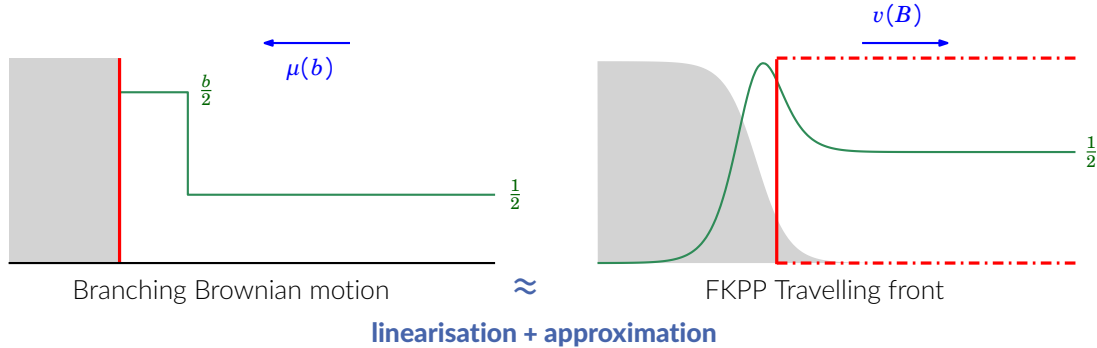
$$r(x) = \frac{1}{2} [(b-1)\mathbf{1}_{x<1} + 1]$$

killing at 0
"critical" drift $-\mu(b)$

A model for travelling fronts ?

Extension of *The genealogy of branching Brownian motion with absorption*, Berestycki, Berestycki, Schweinsberg 2013 ($b = 1, \mu = 1$)

A toy model to investigate the phase diagram

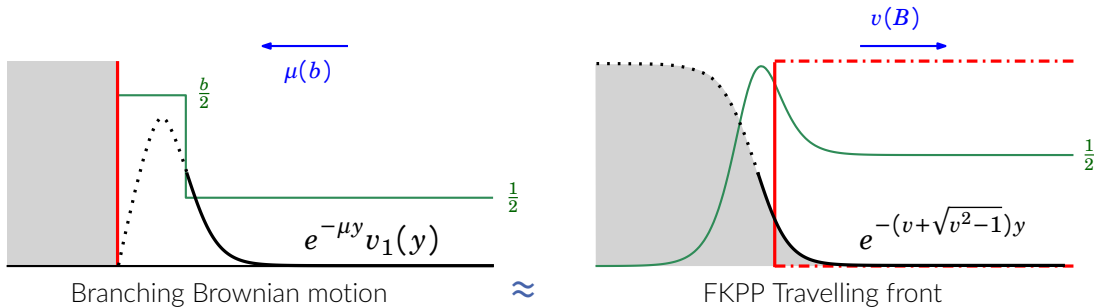


Critical drift

Spectral decomposition of the critical operator $\mathcal{A}u = \frac{1}{2}u'' - \mu u' + r(x)u$ (λ_1, v_1) principal eigenv.

Many-to-one lemma $p_t(x, y) \approx c e^{\lambda_1 t} e^{(\frac{\mu^2}{2} - \frac{1}{2})t} e^{\mu x} v_1(x) e^{-\mu y} v_1(y) \Rightarrow \mu = \sqrt{1 + 2\lambda_1}$

A toy model to investigate the phase diagram



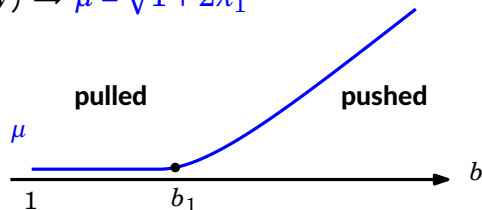
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pulled/pushed regime: $\exists b_1 > 1$ such that

- if $b \in [1, b_1]$, $\lambda_1 = 0 \Rightarrow \mu = 1$,
- if $b > b_1$, $\lambda_1 > 0$ and $\lambda_1 \nearrow b \Rightarrow \mu > 1$, $\mu \nearrow b$
 \leadsto in this case $v_1(x) \propto e^{-\sqrt{\mu^2 - 1}x}$, $x \geq 1$



A toy model to investigate the phase diagram

$$p_t(x, y) \approx c e^{\lambda_1 t} e^{(\mu^2 - 1)t} e^{\mu(x-y)} v_1(x) v_1(y) =: h(x) \tilde{h}(y)$$

reproductive value at x $\xrightarrow{\quad}$ \uparrow
stable configuration $\xrightarrow{\quad}$ \uparrow

$$\mu > 1 \text{ (pushed)} \Rightarrow \Pi(x) \propto e^{-2\sqrt{\mu^2 - 1}x}, \quad x \geq 1$$

\leadsto the **spine** is in the **bulk**

Spine = immortal particle $\Leftrightarrow h$ -transform

$$\mathcal{G}u = \frac{1}{2} \partial_{xx} u - \frac{v_1'(x)}{v_1(x)} \partial_x u$$

$$\text{stationary measure } \Pi(x) = v_1(x)^2 = h(x) \tilde{h}(y)$$

A toy model to investigate the phase diagram

$$p_t(x, y) \approx \cancel{ce^{\lambda_1 t}} \cancel{e^{(\mu^2 - 1)t}} e^{\mu(x-y)} v_1(x) v_1(y) =: h(x) \tilde{h}(y)$$

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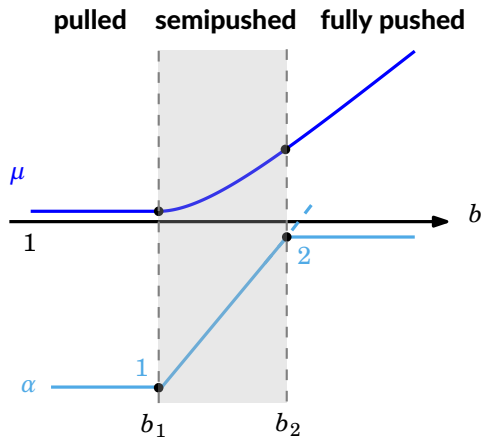
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stationary measure $\Pi(x) = v_1(x)^2 = h(x) \tilde{h}(y)$

$$\text{Let } \alpha := \frac{\mu + \sqrt{\mu^2 - 1}}{\mu - \sqrt{\mu^2 - 1}}$$

pulled/semipushed/fully pushed regime: $\exists b_2 > b_1$ such that

- for $b \in [1, b_1]$, $\mu = 1 \rightarrow \alpha = 1$,
- for $b > b_1$, $\alpha \nearrow b$, $\alpha(b_1) = 1$ and $\alpha(b_2) = 2$.

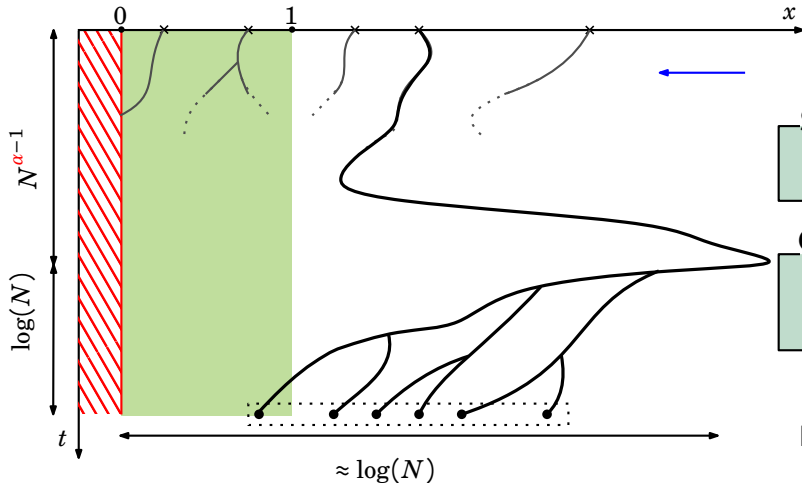


The semipushed regime $b \in (b_1, b_2)$

Start with N particles distributed according to $e^{-\mu y} v_1(y) dy$

Z_t = number of individuals

$N \rightarrow \infty$



SCALING LIMIT

$$\left(\frac{1}{N} Z_{tN^{\alpha-1}}\right) \Rightarrow (\Xi_t) \quad \Xi \text{ is an } \alpha\text{-stable CSBP}$$

GENEALOGY

The genealogy of the BBM converges to a Beta($2 - \alpha, \alpha$)-coalescent

$\bullet \bullet \bullet \bullet \bullet \approx N$ descendants

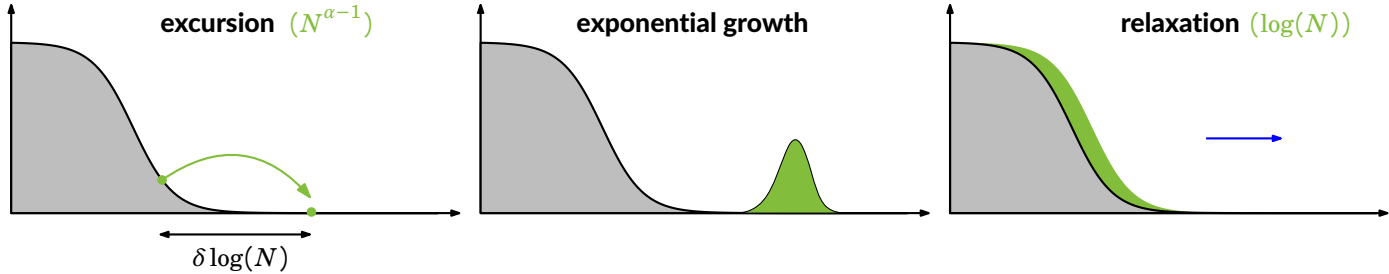
$$\mathbb{P}(\#\bullet > xN) \sim \frac{c}{x^\alpha}$$

A branching particle system as a model of semi pushed fronts. T. 2024.

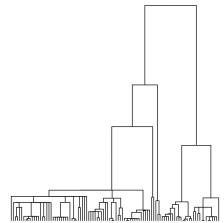
Convergence of spatial branching processes to alpha-stable CSBPs: Genealogy of semi-pushed fronts.

Foutel-Rodier, Schertzer and T. 2025+.

The semipushed regime $b \in (b_1, b_2)$

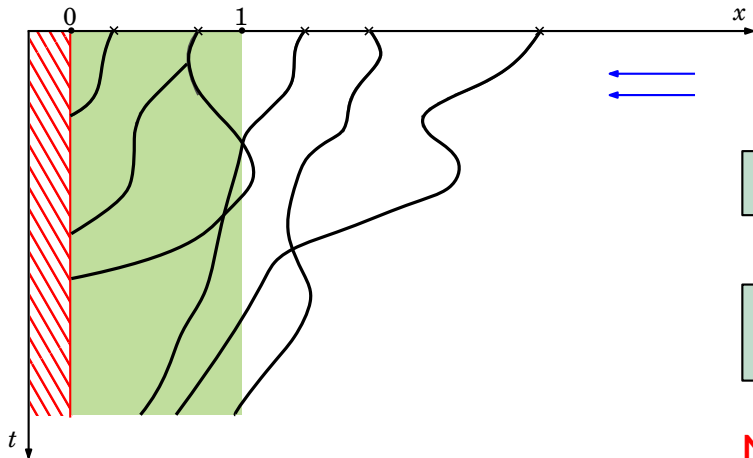


- The invasion is driven by **excursions** of particles
- These excursions generate **large subfamilies** in the associated genealogy, **diversity loss**
- Particles at the tip have a large reproductive value \Rightarrow **large reproductive variance** (in some sense)
- fast relaxation \Rightarrow collapse of structure



The fully pushed regime $b > b_2$

Start with N particles distributed according to $e^{-\mu y} v_1(y) dy$



Z_t = number of individuals
 $N \rightarrow \infty$

SCALING LIMIT

$(\frac{1}{N} Z_{tN}) \Rightarrow (X_t)$ X is a Feller diffusion

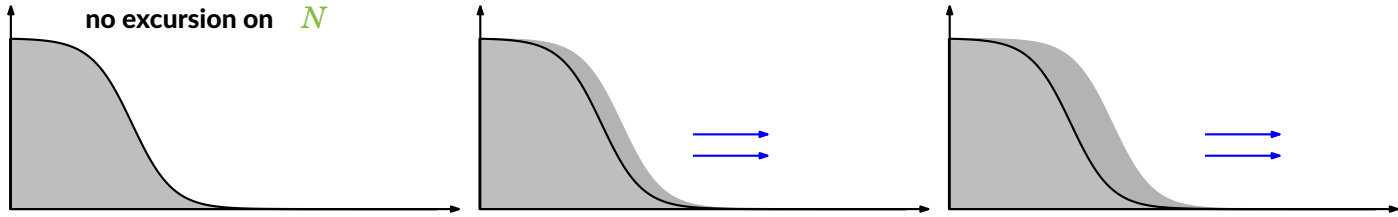
GENEALOGY

The genealogy of the BBM converges to the Kingman coalescent

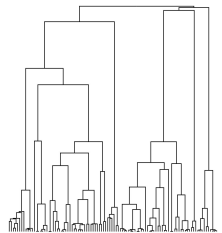
No excursion! \rightsquigarrow “CLT”/mean field

Spectral analysis and k-spine decomposition of inhomogeneous branching Brownian motions. Genealogies in fully pushed fronts. Schertzer and T. 2024.

The fully pushed regime $b > b_2$



- The invasion is pushed by the **growth** in the front
- This generates only **binary mergers** in the associated genealogy, **wide genetic diversity**
- The tip is not accessible \Rightarrow **finite reproductive variance**



The method of moments

Foutel-Rodier, Schertzer '22

The case $k = 1$: many-to-one

\mathcal{N}_t = set of particles alive at t

X_v = position of v

$$\mathbb{E}_x \left[\sum_{v \in \mathcal{N}_t} f(X_v) \right] = \int_0^\infty f(x, y) p_t(x, y)$$

$$\text{with } p_t(x, y) \approx e^{\mu x} v_1(x) e^{-\mu y} v_1(y) =: h(x) \tilde{h}(y)$$

$$\text{reproductive value } \approx h(x) \int_0^\infty f(x, y) \tilde{h}(y) dy$$

stable configuration

The method of moments

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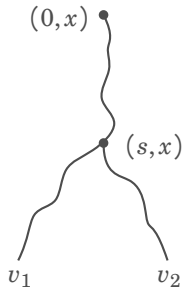
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$$\text{reproductive value } \xrightarrow{\text{blue arrow}} \approx h(x) \int_0^\infty f(x, y) \tilde{h}(y) dy \xleftarrow{\text{green arrow}} \text{stable configuration}$$

The case $k = 2$

$$\mathbb{E}_x \left[\sum_{v_1 \neq v_2 \in \mathcal{N}_t} f(X_{v_1}) g(X_{v_2}) \right] = \int_0^\infty \int_0^t 2r(y) p_s(x, y) \left(\int_0^\infty f(z) p_{t-s}(y, z) dz \right) \left(\int_0^\infty g(z) p_{t-s}(y, z) dz \right) ds dy$$

$$\approx 2t h(x) \underbrace{\left(\int_0^\infty r(y) \tilde{h}(y) h(y)^2 dy \right)}_{=: \Sigma^2} \left(\int_0^\infty f(z) \tilde{h}(z) dz \right) \left(\int_0^\infty g(z) \tilde{h}(z) dz \right)$$



The method of moments

Foutel-Rodier, Schertzer '22

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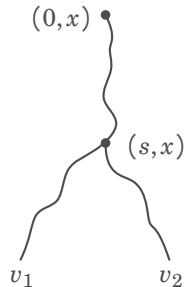
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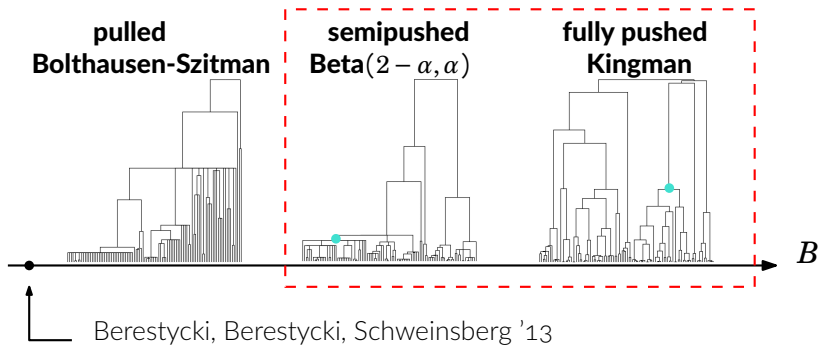
\leadsto position of the branching point

$$h(y)^2 \tilde{h}(y) \propto e^{(\mu - 3\sqrt{\mu^2 - 1})y} \quad \text{and} \quad \alpha \leq 2 \iff \mu \geq 3\sqrt{\mu^2 - 1}$$



| $\alpha \leq 2$ | $\alpha > 2$ |
|---------------------|---------------------|
| $\Sigma^2 = \infty$ | $\Sigma^2 < \infty$ |
| tip | bulk |

F-KPP fronts with cooperation/Allee effects



Definition of a **toy model** for **pushed** fronts falling in the universality class of FKPP equation

(1) phase diagram

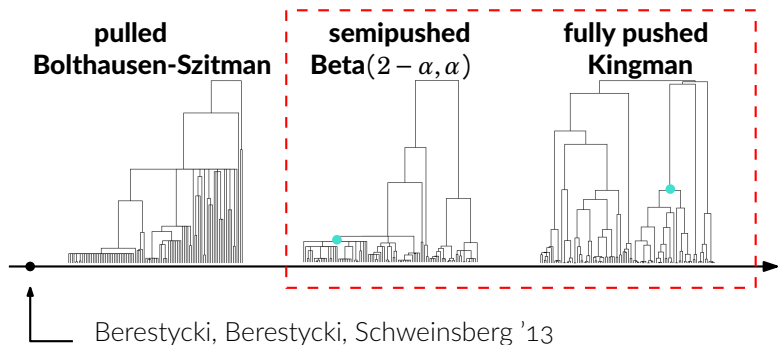
in accordance with Birzu *et al.* '20

(2) internal mechanisms

speed of invasion \leftrightarrow **genetic composition**

| | | | |
|----------|------------|-------------|-------------|
| lineages | at the tip | in the bulk | in the bulk |
| • | at the tip | at the tip | in the bulk |

F-KPP fronts with cooperation/Allee effects



| | | | |
|----------|------------|-------------|-------------|
| lineages | at the tip | in the bulk | in the bulk |
| ● | at the tip | at the tip | in the bulk |

(2) **analytical criteria** for the emergence of exchangeable genealogies in structured models

spectral theory: fast mixing, reproductive variance

Definition of a **toy model** for **pushed** fronts falling in the universality class of FKPP equation

(1) phase diagram

in accordance with Birzu *et al.* '20

(2) internal mechanisms

speed of invasion ↔ genetic composition

Tools

(1) extension of the **method of moments** to genealogies of branching diffusions

spinal decomposition

↪ location of the ancestral lineages