Properties of the tip of one-dimensional branching random walks: analytical and numerical results, and motivations from QCD

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# Outline

\* From particle physics to branching processes

\* Genealogy of particles ending up beyond a predefined position

\* An exact Monte Carlo algorithm to generate the tip of BRWs at large times

Work reported here done in collaboration with A.H. Mueller, É. Brunet, A.D. Le

### Hadron-nucleus scattering amplitudes

Large nucleus at rest

Right-moving hadron at rapidity y (~ log of energy)



When it interacts with the nucleus, the latter breaks and new particles are seen in the detector (in general, many, covering a large solid angle around the flight direction of the initial hadron).

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What is the probability that an interaction occurs?



# Hadron-nucleus scattering amplitudes: a FKPP problem

Let us consider the simplest hadron: a quark-antiquark pair (= meson) Characterized by a two-dimensional size vector r<sub>o</sub>



An equation for the probability (amplitude) has been derived from QCD (Balitsky, 1996; Kovchegov, 1999).

n) Large nucleus at rest R Characterized by a distance scale R

It takes the form of an evolution equation in the rapidity y

$$\partial_{y} T(r_{0}, y) = \bar{\alpha} \int \frac{d^{2}r_{1}}{2\pi} \frac{r_{0}^{2}}{r_{1}^{2}(r_{0} - r_{1})^{2}} [T(r_{1}, y) + T(r_{0} - r_{1}, y) - T(r_{0}, y) - T(r_{1}, y) T(r_{0} - r_{1}, y)]$$
  
$$T(r_{0}, y = 0) = \Theta(|r_{0}| - R)$$

which is actually "FKPP-like" i.e. in the same universality class as  $\partial_t u(t,x) = \frac{1}{2} \partial_x^2 u(t,x) + u(t,x) [1 - u(t,x)]$ 

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#### We are going to interpret this equation physically.





Interaction probability (amplitude): T = 1 if  $|r_0| > R$ T = 0 else



Actually, the hadron is "seen" from the nucleus in an actual quark-antiquark state only if it is *very* slow (rapidity  $y \approx 0$ ), namely almost at rest.

Interaction probability (amplitude): T = 1 if  $|r_0| > R$ T = 0 also

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Interaction probability (amplitude): T = 1 if  $|r_1|$  or  $|r_0-r_1| > R$ T = 0 else



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### In general, the bare state is "dressed" by quantum fluctuations, essentially in the form of additional gluons

The gluon can be thought of as been radiated by the quark or the antiquark as the rapidity increases by **dy**.

The probability of a branching is computed from QCD:

$$\overline{\alpha} \, dy \frac{d^2 r_1}{2 \pi} \frac{r_0^2}{r_1^2 (r_0 - r_1)^2}$$

coupling constant

Interaction probability (amplitude): T = 1 if  $|r_1|$  or  $|r_0-r_1| > R$ T = 0 else



The gluons may also branch into other gluons with the same probability function

$$\bar{\alpha} dy \frac{d^2 r_2}{2\pi} \frac{r_1^2}{r_2^2 (r_1 - r_2)^2}$$

coupling constant

Interaction probability (amplitude): T = 1 if at least one size > R T = 0 else



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The Balitsky-Kovchegov equation

$$\partial_{y} T(r_{0}, y) = \bar{\alpha} \int \frac{d^{2}r_{1}}{2\pi} \frac{r_{0}^{2}}{r_{1}^{2}(r_{0} - r_{1})^{2}} [T(r_{1}, y) + T(r_{0} - r_{1}, y) - T(r_{0}, y) - T(r_{1}, y) T(r_{0} - r_{1}, y)]$$
  
T(r\_{0}, y=0)= $\Theta(|r_{0}| - R)$ 

is now understood as an equation for the probability that there is at least one object of size larger than R produced by the branching process iterated to rapidity y.





Define 
$$T_{in}$$
 as follows: for  $y=y_0$ ,  $T_{in}(r_0, y_0; y_0) = 2T(r_0, y_0) - T^2(t_0, y_0)$  and for  $y>y_0$ :  
 $\partial_y T_{in}(r_0, y; y_0) = \bar{\alpha} \int \frac{d^2 r_1}{2\pi} \frac{r_0^2}{r_1^2(r_0 - r_1)^2} [T_{in}(r_1, y; y_0) + T_{in}(r_0 - r_1, y; y_0) - T_{in}(r_0, y; y_0) - T_{in}(r_1, y; y_0) T_{in}(r_0 - r_1, y; y_0)]$   
The distribution of  $y_0$  reads  $\frac{1}{2T(r_0, Y)} \frac{\partial}{\partial y_0} T_{in}(r_0, Y; y_0)$ 



Interpretation: T<sub>in</sub> turns out to be twice the probability that the objects of size larger than R at rapidity y had an odd number of ancestors at rapidity Y-y<sub>0</sub>

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We consider realizations of the one-dimensional BBM such that the initial particle at position x=0 has its rightmost offspring at a position larger than X (i.e. it is "red", by definition) at the final time T.







# Genealogies: two formulas



Distribution of the branching time of the last common ancestor of all red particles

Probability density of the overlap  $q = \frac{t_{LCA}}{T}$ 

$$\pi(q) \simeq \frac{1}{2\sqrt{\pi T}} \frac{1}{q^{3/2} (1-q)^{3/2}}$$

Le, Mueller, SM, Phys.Rev. D 103 (2021) 054031

This is the same formula as for the distribution of the overlaps of two extremal particles in unconditioned BBM conjectured by Derrida & Mottishaw, EPL, **115** (2016) 40005

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#### Distribution of the number of red particles at a given time

Probability to have k red particles at  $t_0$  given there is at least one:

$$r_{k\geq 2}(t_0) \simeq \left(\frac{1}{\sqrt{\pi(T-t_0)}} + \frac{1}{\sqrt{2}(X-m_T)}\right) \frac{1}{k(k-1)}$$

Le, Mueller, SM, Phys.Rev. D 104 (2021) 034026

# Formulation using a generating function

Probability that a particle at x at time t is red: U(t, x) = u(T-t, X-x)

Call  $Q_k(t, x; t_0)$  the probability that the particle at x at time t has k red offspring at time  $t_0$ :

$$r_k(t_0) = \frac{Q_k(0,0;t_0)}{U(0,0)}$$

Generating function:  $U_{\lambda}(t,x;t_0) = 1 - \sum_k \lambda^k Q_k(t,x;t_0)$ 

<u>Fact</u>:  $v(t,x) = U_{\lambda}(t_0 - t, x; t_0)$  obeys the FKPP equation with initial condition  $v(0,x) = (1 - \lambda)U(t_0,x)$ 

Hence our observables may be deduced from a solution to the FKPP equation with peculiar initial conditions. It amounts to computing a shift of the large-time position of the TW due to the initial conditions.

There is also a probabilistic method: it requires however to use the phenomenological model for BBM [see Brunet, Derrida, Mueller, SM (2005); Mueller, SM (2014)]

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- For some observables (e.g. the overlap), the best method is to solve the evolution equation for the generating function (or its discretized version)
- For observables such as r<sub>k</sub> for k not small, or for observables dominated by typical realizations, it is
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#### Monte Carlo simulations are indicated for such observables!

But our observables use ensembles of rare realizations, evolved to large times... a "naive" implementation would clearly be unuseful.

On the other hand, we only care about the particles that arrive near the extremal one. Is there a way to evolve exactly *only these particles*?

# Realization of the tail of a BBM (actually BRW)

<u>Conditioning</u>: at least one particle beyond X (far from  $m_{\tau}$ )

Keep all particles arriving in  $[X-\Delta, +\infty)$ 



Brunet, Le, Mueller, SM, EPL, 131 (2020) 40002

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Start with a single particle at the origin.

The probability that the rightmost particle has a position larger than x at time t satisfies

$$u(t+dt,x) = p_r u(t,x-dx) + p_l u(t,x+dx) + r u(t,x)[2-u(t,x)]$$
  $u(t=0,x) = \Theta(-x)$ 

The probability that the particle at x at time t is red reads U(t, x) = u(T - t, X - x)

Consider generically one particle at position *x* at time *t*.

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• Proba that it jumps **left** *given* that it is red:

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branch: • Proba that it branches into two red given that it is red:  $P(2 \text{ red} | \text{ red}) = r \frac{[U(t+dt,x)]^2}{U(t,x)}$ 

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• Proba that it branches into **one red** and **one non-red** given that it is red:

$$P(\text{red+non-red} | \text{red}) = r \frac{2U(t+dt, x)[1-U(t+dt, x)]}{U(t, x)}$$

In this case, the nothing actually happens to the red particle.

<u>Definitions</u>: A particle is orange if it has its rightmost offspring in  $[X-\Delta,X)$  at time *T*. A particle is blue if it has its rightmost offspring in  $(-\infty, X-\Delta)$  at time *T*.

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Orange particles are created from branching of red particles

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The probability that the particle at x at time t is orange reads  $V_{\Delta}(t,x) = U(t,x+\Delta) - U(t,x)$ Orange particles are created from branching of red particles  $P(\text{red+orange} | \text{red}) = r \frac{2U(t+dt, x)V_{\Delta}(t+dt, x)}{U(t-x)}$ Moves: Proba that it jumps **right or left** *given* that it is or left: the same as for the red particles, with the substitution  $U \rightarrow V_{\Lambda}$ Branchings: • Proba that it branches in two orange given that it is orange: The same as for the red particles, with the substitution  $U \rightarrow V_{\Lambda}$ • Proba that it branches in **one orange** and **one blue** given that it is orange:  $P(\text{orange+blue} | \text{orange}) = r \frac{2V_{\Delta}(t+dt,x)[1-U(t+dt,x+\Delta)]}{V_{\Delta}(t-x)}$ 

# Numerical check of the formula for $r_k$ $r_{k\geq 2}(t_0) \simeq \left(\frac{1}{\sqrt{\pi(T-t_0)}} + \frac{1}{\sqrt{2}(X-m_T)}\right) \frac{1}{k(k-1)}$



# **Continuous limit and variants**

$$p_{r} = p_{l} = \frac{1}{2}(1 - dt), \ r = dt, \ dx^{2} = dt, \ dt \rightarrow 0$$
$$\partial_{t} u(t, x) = \frac{1}{2} \partial_{x}^{2} u(t, x) + u(t, x) [1 - u(t, x)]$$

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We find that the subtree of red particles is a (unconditioned) BBM with drift  $\partial_x \ln U(t, x)$ and branching rate U(t, x)

We may ask the lead particle at time *T* to be at *X* **exactly**.

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Then the drift becomes \partial_x \ln \partial_x U(t, x)
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The trajectory of the red particle probably coincides with the spine.





Number of orange particles when the position of the lead particle is fixed



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$$\overline{n}(\Delta) \propto e^{\sqrt{2}\Delta}$$

$$n_{typical}(\Delta) \propto \exp\left(\sqrt{2}\Delta - \zeta \Delta^{2/3}\right)$$
Undetermined constant
$$1 \ll X - m_T \ll \sqrt{T}$$

$$X - \Delta - m_T \gg 1, \ \Delta \gg 1$$

#### Mueller & SM, Phys.Rev. E 102 (2020) 022104

Formulas obtained from a very, very laborious calculation based on a generating function (Mueller, SM, Phys.Rev. E, 2020), following a formulation of such problems due to Brunet & Derrida (2011).

<u>NB</u>: This formula can be recovered from a probabilistic picture, in a more straightforward way... maybe probabilists will be able to determine the unknown constant?

Numerical check of 
$$\frac{n_{typical}}{\overline{n}} \sim e^{-\zeta \Delta^{2/3}}$$



# Summary

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# Outlook

- Try to understand the full genealogy of the subtree of red particles?
- Understand more completely the density of particles at the tip, possibly in the stochastic picture, which is more "physical"?