

Stochastic Analysis of the Neutron Transport Equation

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NEUTRON FLUX

- ▶ **Neutron flux** is a measure of the intensity of neutron radiation, determined by the rate of flow of neutrons.
- ▶ The neutron flux value is calculated as:

$$\text{neutron density } (n) \times \text{neutron velocity } (v)$$

where n is measured in (# neutrons)/cm³ and v is measured in distance cm/s

- ▶ Consequently, neutron flux (nv) is measured in (# neutrons)/cm²/s.
- ▶ We want to describe neutron flux as a function of spatial position and time in complex domains:

$$\psi_g(r, v, t), \quad r \in D_0 \subseteq \mathbb{R}^d, v \in V := [v_{\min}, v_{\max}] \times \mathbb{S}_2,$$

for $0 < v_{\min} < v_{\max} < \infty$.

- ▶ Sometimes neutron flux is also taken as a function of energy E , but in many settings, this is related to velocity via the relation

$$|v| = \sqrt{\frac{2E}{m}},$$

where m is neutron.

- ▶ More generally the flux of any radioactive particle can be seen in the same way: α, β, γ radiation.

NEUTRON TRANSPORT EQUATION

Neutron flux is thus identified as $\Psi_g : D \times V \rightarrow [0, \infty)$, which solves the integro-differential equation

$$\begin{aligned} & \frac{\partial \Psi_g}{\partial t}(t, r, v) + v \cdot \nabla \Psi_g(t, r, v) + \sigma(r, v) \Psi_g(t, r, v) \\ &= Q(r, v, t) + \int_V \Psi_g(r, v', t) \sigma_s(r, v') \pi_s(r, v', v) dv' + \int_V \Psi_g(r, v', t) \sigma_f(r, v') \pi_f(r, v', v) dv', \end{aligned}$$

where the different components are measurable in their dependency on (r, v) and are explained as follows:

$\sigma_s(r, v')$: the rate at which scattering occurs from incoming velocity v' ,

$\sigma_f(r, v')$: the rate at which fission occurs from incoming velocity v' ,

$\sigma(r, v)$: the sum of the rates $\sigma_f + \sigma_s$ and is known as the cross section,

$\pi_s(r, v', v) dv'$: the scattering yield at velocity v from incoming velocity v' ,
satisfying $\pi_s(r, v, V) = 1$,

$\pi_f(r, v', v) dv'$: the average neutron yield at velocity v from fission with
incoming velocity v' , satisfying $\pi_f(r, v, V) < \infty$

$Q(r, v, t)$: non-negative source term. (Immediately remove the source term $Q = 0$)

We will assume that all quantities are uniformly bounded away from zero and infinity.

BOUNDARY CONDITIONS

- ▶ Boundary conditions which represent 'fission containment'

$$\begin{cases} \Psi_g(0, r, v) = g(r, v) & \text{for } r \in D, v \in V, \text{ (initial condition)} \\ \Psi_g(t, r, v) = g(r, v) = 0 & \text{for } r \in \partial D \text{ if } v \cdot \mathbf{n}_r < 0, \text{ (neutron annihilation)} \end{cases}$$

- ▶ \mathbf{n}_r is the outward facing normal of D at $r \in \partial D$
- ▶ $g : D \times V \rightarrow [0, \infty)$ is a bounded, measurable function which we will later assume has some additional properties.

(FORWARD \rightarrow BACKWARDS) NEUTRON TRANSPORT EQUATION

- ▶ Hence, with similar computations, this tells us that, for $f, g \in L^2(D \times V)$,

$$\langle f, (\mathcal{T} + \mathcal{S} + \mathcal{F})g \rangle = \langle (\mathcal{T} + \mathcal{S} + \mathcal{F})f, g \rangle,$$

where

$$\left\{ \begin{array}{ll} \mathcal{T}f(r, v) & := v \cdot \nabla f(r, v) & \text{(backwards transport)} \\ \mathcal{S}f(r, v) & := \sigma_s(r, v) \int_V f(r, v') \pi_s(r, v, v') dv' - \sigma_s(r, v) f(r, v) & \text{(backwards scattering)} \\ \mathcal{F}f(r, v) & := \sigma_f(r, v) \int_V f(r, v') \pi_f(r, v, v') dv' - \sigma_f(r, v) f(r, v) & \text{(backwards fission)} \end{array} \right.$$

- ▶ This leads us to the so called *backwards neutron transport equation* (which is also known as the *adjoint neutron transport equation*) given by the Abstract Cauchy Problem on $L^2(D \times V)$,

$$\frac{\partial \psi_g}{\partial t}(t, \cdot, \cdot) = (\mathcal{T} + \mathcal{S} + \mathcal{F})\psi_g(t, \cdot, \cdot)$$

with additional boundary conditions

$$\left\{ \begin{array}{ll} \psi_g(0, r, v) = g(r, v) & \text{for } r \in D, v \in V, \\ \psi_g(t, r, v) = 0 & \text{for } r \in \partial D \text{ if } v \cdot \mathbf{n}_r > 0. \end{array} \right.$$

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UNDERLYING STOCHASTICS (LEADING TO MONTE-CARLO)

- ▶ Backwards equation lends itself well to stochastic representation **in the L_2 sense**,

$$\begin{aligned} \frac{\partial \psi_g}{\partial t}(t, r, v) &= v \cdot \nabla \psi_g(t, r, v) - \sigma(r, v) \psi_g(t, r, v) \\ &\quad + \sigma_s(r, v) \int_V \psi_g(r, v', t) \pi_s(r, v, v') dv' + \sigma_f(r, v) \int_V \psi_g(r, v', t) \pi_f(r, v, v') dv'. \end{aligned}$$

- ▶ The physical process of fission is a Markov-additive branching process (*neutron branching process*).
- ▶ Represented by a configuration of physical location and velocity of particles in $D \times V$, say $\{(r_i(t), v_i(t)) : i = 1, \dots, N_t\}$, where N_t is the number of particles alive at time $t \geq 0$.
- ▶ Represent as a process in the space of the atomic measures

$$X_t(A) = \sum_{i=1}^{N_t} \delta_{(r_i(t), v_i(t))}(A), \quad A \in \mathcal{B}(D \times V), \quad t \geq 0,$$

where δ is the Dirac measure, define on $\mathcal{B}(D \times V)$, the Borel subsets of D .

- ▶ Then the stochastic representation of the backwards NTE is nothing more than

$$\phi_t[g](r, v) = \mathbb{E}_{\delta_{(r, v)}}[g, X_t] = \mathbb{E}_{\delta_{(r, v)}} \left[\sum_{i=1}^{N_t} g(r_i(t), v_i(t)) \right], \quad t \geq 0.$$

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NEUTRON BRANCHING PROCESS

- ▶ A particle position at r with velocity v (configuration (r, v)) will continue to move along the trajectory $r + vt$, until one of the following things happens.
- ▶ The particles that leave the physical domain D are killed.
- ▶ For a neutron with configuration (r, v) , if T_s is the random time that scattering may occur, then

$$\Pr(T_s > t) = \exp \left\{ - \int_0^t \sigma_s(r + vt, v) ds \right\}.$$

- ▶ When scattering occurs at space-velocity (r, v) , the new velocity is selected independently with probability $\pi_s(r, v, v') dv'$.
- ▶ For a neutron with configuration (r, v) , if T_f is the random time that scattering may occur, then independently of any other physical event that may affect the neutron,

$$\Pr(T_f > t) = \exp \left\{ - \int_0^t \sigma_f(r + vt, v) ds \right\}.$$

- ▶ When fission occurs at location $r \in \mathbb{R}^d$ from a particle with incoming velocity $v \in V$, the quantity $\pi_f(r, v, v') dv'$ describes the average number of particles released from nuclear fission with outgoing velocity in the infinitesimal neighbourhood of v' .
- ▶ Note, the possibility that $\Pr(N = 0) > 0$ is possible, which will be tantamount to a fission taking place in which no neutrons are released. Experiments show that this is a possible outcome during a fission event.

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MILD EQUATION

- Define for $g \in L_\infty^+(D \times V)$, **the (physical process) expectation semigroup**

$$\phi_t[g](r, v) := \mathbb{E}_{\delta_{(r,v)}}[\langle g, X_t \rangle], \quad t \geq 0, r \in D, v \in V,$$

and the advection semigroup

$$U_t[g](r, v) = g(r + vt, v) \mathbf{1}_{\{t < \kappa_{r,v}^D\}}, \quad t \geq 0.$$

where $\kappa_{r,v}^D := \inf\{t > 0 : r + vt \notin D\}$.

Lemma

When $g \in L_\infty^+(D \times V)$, the space of non-negative functions in $L_\infty^+(D \times V)$, the expectation semigroup $(\phi_t[g], t \geq 0)$ is the unique bounded solution to the mild equation

$$\phi_t[g] = U_t[g] + \int_0^t U_s[(S + \mathcal{F})\phi_{t-s}[g]] ds, \quad t \geq 0.$$

Lemma

The mild solution $(\phi_t, t \geq 0)$, is equal on $L_2(D \times V)$ to $(\psi_g(t, \cdot, \cdot), t \geq 0)$ and dual to $(\Psi_g(t, \cdot, \cdot), t \geq 0)$ on $L_2(D \times V)$, i.e.

$$\langle f, \phi_t[g] \rangle = \langle f, \psi_g(t, \cdot, \cdot) \rangle = \langle \Psi_f(t, \cdot, \cdot), g \rangle$$

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$$U_t[g](r, v) = g(r + vt, v) \mathbf{1}_{\{t < \kappa_{r,v}^D\}}, \quad t \geq 0.$$

where $\kappa_{r,v}^D := \inf\{t > 0 : r + vt \notin D\}$.

Lemma

When $g \in L_\infty^+(D \times V)$, the space of non-negative functions in $L_\infty^+(D \times V)$, the expectation semigroup $(\phi_t[g], t \geq 0)$ is the unique bounded solution to the mild equation

$$\phi_t[g] = U_t[g] + \int_0^t U_s[(\mathcal{S} + \mathcal{F})\phi_{t-s}[g]] ds, \quad t \geq 0.$$

Lemma

The mild solution $(\phi_t, t \geq 0)$, is equal on $L_2(D \times V)$ to $(\psi_g(t, \cdot, \cdot), t \geq 0)$ and dual to $(\Psi_g(t, \cdot, \cdot), t \geq 0)$ on $L_2(D \times V)$, i.e.

$$\langle f, \phi_t[g] \rangle = \langle f, \psi_g(t, \cdot, \cdot) \rangle = \langle \Psi_f(t, \cdot, \cdot), g \rangle$$

for all $f, g \in L_2(D \times V)$.

λ -EIGENVALUE PROBLEM

- So far

$$\langle f, \phi_t[g] \rangle = \langle \Psi_f(t, \cdot, \cdot), g \rangle$$

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$$\langle f, \phi_t[\tilde{\varphi}] \rangle = \langle \Psi_f(t, \cdot, \cdot), \tilde{\varphi} \rangle = e^{\lambda t} \langle f, \tilde{\varphi} \rangle$$

suggesting (at least in the $L_2(D \times V)$ sense)

$$\phi_t[\tilde{\varphi}](r, v) = \mathbb{E}_{\delta_{(r,v)}}[\langle \tilde{\varphi}, X_t \rangle] := e^{\lambda t} \tilde{\varphi}(r, v)$$

⇒ points us towards Monte-Carlo methods - especially when $\lambda = 0$

- **Problem!** No good unless $\tilde{\varphi} \in L_\infty^+(D \times V)$, but we only know $\tilde{\varphi} \in L_2^+(D \times V)$

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PERRON-FROBENIUS

Theorem (Horton, K., Villemonais, 2018)

Suppose that

- ▶ D is non-empty and convex;
- ▶ Cross-sections $\sigma_s, \sigma_f, \pi_s$ and π_f are uniformly bounded away from infinity;
- ▶ $\inf_{r \in D, v, v' \in V} (\sigma_s(r, v)\pi_s(r, v, v') + \sigma_f(r, v)\pi_f(r, v, v')) > 0$

Then, for the semigroup $(\phi_t, t \geq 0)$, there exists a $\lambda_* \in \mathbb{R}$, a positive¹ right eigenfunction $\varphi \in L_\infty^+(D \times V)$ and a left eigenmeasure which is absolutely continuous with respect to Lebesgue measure on $D \times V$ with density $\tilde{\varphi} \in L_\infty^+(D \times V)$, both having associated eigenvalue $e^{\lambda_* t}$, and such that φ (resp. $\tilde{\varphi}$) is uniformly (resp. a.e. uniformly) bounded away from zero on each compactly embedded subset of $D \times V$. In particular, for all $g \in L_\infty^+(D \times V)$,

$$\langle \tilde{\varphi}, \phi_t[g] \rangle = e^{\lambda_* t} \langle \tilde{\varphi}, g \rangle \quad (\text{resp. } \phi_t[\varphi] = e^{\lambda_* t} \varphi) \quad t \geq 0.$$

Moreover, there exists $\varepsilon > 0$ such that

$$\sup_{g \in L_\infty^+(D \times V): \|g\|_\infty \leq 1} \left\| e^{-\lambda_* t} \varphi^{-1} \phi_t[g] - \langle \tilde{\varphi}, g \rangle \right\|_\infty = O(e^{-\varepsilon t}) \text{ as } t \rightarrow \infty.$$

¹To be precise, by a positive eigenfunction, we mean a mapping from $D \times V \rightarrow (0, \infty)$. This does not prevent it being valued zero on ∂D , as D is an open bounded, convex domain.

STOCHASTIC PERRON-FROBENIUS

If the neutron branching process (physical process) begins from a configuration $\mu = \sum_{i=1}^n \delta_{x_i}$, then

$$W_t := e^{-\lambda_* t} \frac{\langle \varphi, X_t \rangle}{\langle \varphi, \mu \rangle}, \quad t \geq 0,$$

is a martingale.

Theorem (Horton, K. Villemonais)

Suppose that

- ▶ D is non-empty and convex;
- ▶ Cross-sections $\sigma_s, \sigma_f, \pi_s$ and π_f are uniformly bounded away from infinity;
- ▶ We have $\sigma_s \pi_s + \sigma_f \pi_f > 0$ on $D \times V \times V$;
- ▶ There is an open ball B compactly embedded in D such that $\inf_{r \in D, v, v' \in V} \sigma_f(r, v, v') \pi_f(r, v, v') > 0$.

For all $g \in L_\infty^+(D \times V)$ such that, up to a multiplicative constant, $g \leq \varphi$, under the assumptions as the previous Theorem,

$$\lim_{t \rightarrow \infty} e^{-\lambda_* t} \langle g, X_t \rangle = \langle g, \tilde{\varphi} \rangle W_\infty.$$

almost surely, where W_∞ is the martingale limit. Moreover, W_∞ is positive with positive probability if and only if $\lambda_* > 0$, otherwise $W_\infty = 0$.

λ -EIGENVALUE AND MC LOGIC

- ▶ Suppose now we can efficiently simulate the Neutron branching process, recalling that

$$\phi_t[g](r, v) := \mathbb{E}_{\delta_{(r, v)}}[\langle g, X_t \rangle], \quad t \geq 0, r \in D, v \in V,$$



$$\lambda_* = \lim_{t \rightarrow \infty} \frac{1}{t} \log \phi_t[g](r, v) = \lim_{t \rightarrow \infty} \frac{1}{t} \log \mathbb{E}_{\delta_{(r, v)}}[\langle g, X_t \rangle], \quad t \geq 0, r \in D, v \in V.$$

- ▶ and e.g. fix $r \in D, v \in V,$

$$\frac{\langle \tilde{\varphi}, g \rangle}{\langle \tilde{\varphi}, 1 \rangle} = \lim_{t \rightarrow \infty} \frac{\phi_t[g](r, v)}{\phi_t[1](r, v)} = \lim_{t \rightarrow \infty} \frac{\mathbb{E}_{\delta_{(r, v)}}[\langle g, X_t \rangle]}{\mathbb{E}_{\delta_{(r, v)}}[\langle 1, X_t \rangle]}$$

where g is a test function in $L_{\infty}^+(D \times V)$.

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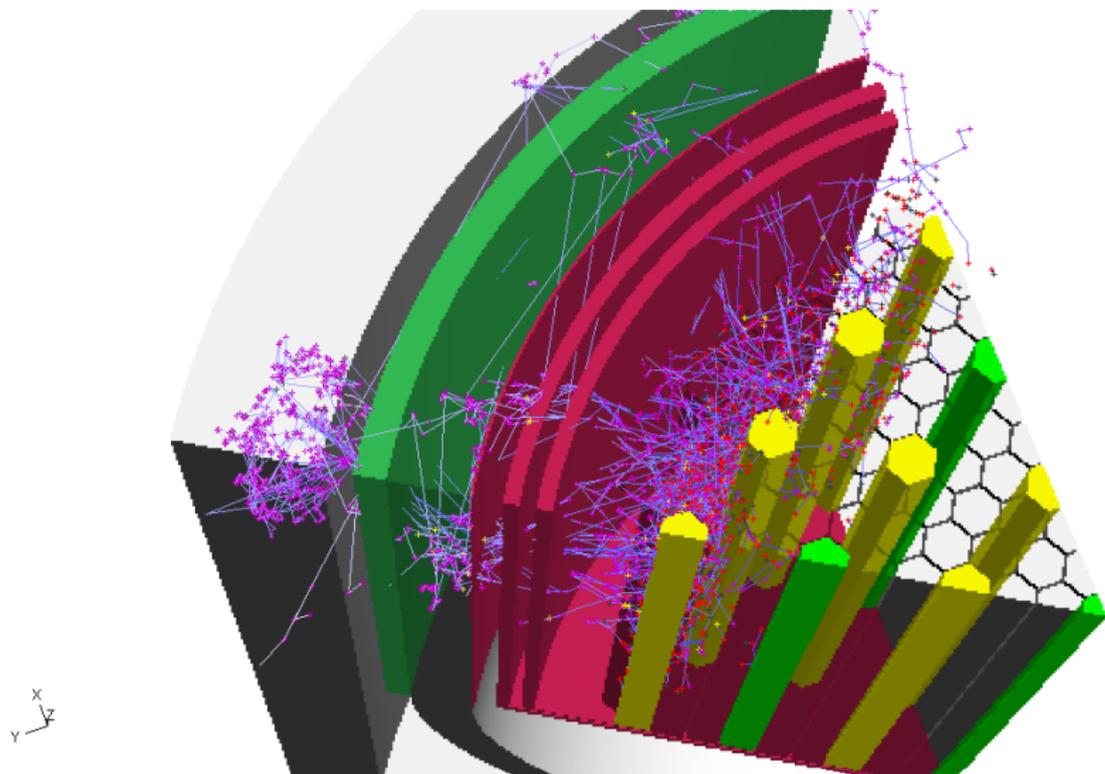
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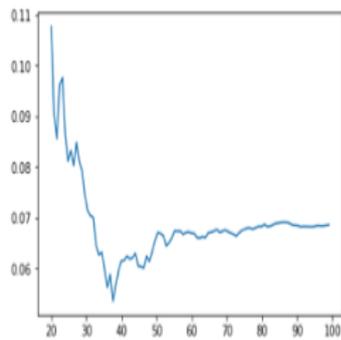
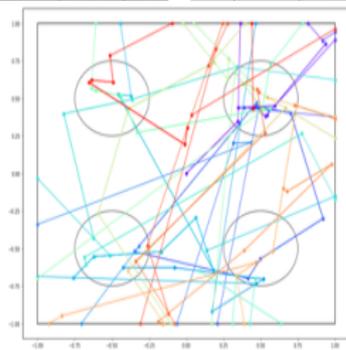
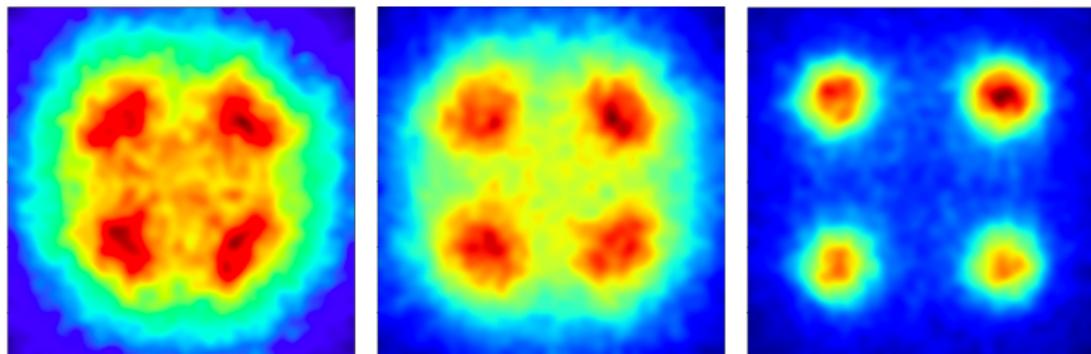
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Monte-Carlo, Importance Map $\tilde{\varphi}$



Monte-Carlo, Importance Map $\tilde{\varphi}$



MANY-TO-ONE AND MONTE-CARLO PARALLELISATION

- ▶ Recall semigroup operators

$$\mathcal{T}f(r, v) := v \cdot \nabla f(r, v) \quad (\text{backwards transport})$$

$$\mathcal{S}f(r, v) := \sigma_s(r, v) \int_V (f(r, v') - f(r, v)) \pi_s(r, v, v') dv' \quad (\text{backwards scattering})$$

$$\mathcal{F}f(r, v) := \sigma_f(r, v) \int_V f(r, v') \pi_f(r, v, v') dv' - \sigma_f(r, v) f(r, v) \quad (\text{backwards fission})$$

- ▶ Basic algebra gives

$$\mathcal{T} + \mathcal{S} + \mathcal{F} = v \cdot \nabla f(r, v, t) + \alpha(r, v) \int_V (f(r, v', t) - f(r, v, t)) \pi(r, v, v') dv' + \beta(r, v) f(r, v)$$

where

$$\alpha(r, v) := \sigma_s(r, v) + \sigma_f(r, v) \int_V \pi_f(r, v, v') dv',$$

$$\pi(r, v, v') dv' := \alpha(r, v)^{-1} [\sigma_s(r, v) \pi_s(r, v, v') dv' + \sigma_f(r, v) \pi_f(r, v, v') dv'],$$

$$\beta(r, v) := \alpha(r, v) - \sigma_s(r, v) - \sigma_f(r, v) = \sigma_f(r, v) \left(\int_V \pi_f(r, v, v') dv' - 1 \right).$$

MANY-TO-ONE AND MONTE-CARLO PARALLELISATION

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$$\mathcal{T} + \mathcal{S} + \mathcal{F} = v \cdot \nabla f(r, v, t) + \alpha(r, v) \int_V (f(r, v', t) - f(r, v, t)) \pi(r, v, v') dv' + \beta(r, v) f(r, v)$$

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MANY-TO-ONE AND MONTE-CARLO PARALLELISATION

- ▶ The representation $\mathcal{T} + \mathcal{S} + \mathcal{F} = \mathcal{L} + \beta$, where

$$\mathcal{L}f(r, v) = v \cdot \nabla f(r, v, t) + \alpha(r, v) \int_V (f(r, v', t) - f(r, v, t)) \pi(r, v, v') dv'.$$

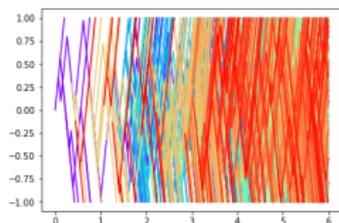
This is the Markov generator of a **neutron random walk (NRW)** (R, Υ) (scatters at rate α and chooses new velocity with distribution π) with probabilities $(\mathbf{P}_{(r,v)}, r \in D, v \in V)$. We have a new representation in terms of (R, Υ) ,

$$\phi_t[g](r, v) = \mathbb{E}_{\delta_{(r,v)}}[\langle g, X_t \rangle] = \mathbf{E}_{(r,v)} \left[e^{\int_0^t \beta(R_u, \Upsilon_u) du} g(R_t, \Upsilon_t) \mathbf{1}_{(t < \tau^D)} \right],$$

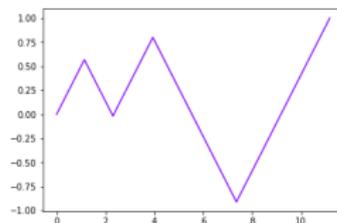
for $t \geq 0, r \in D, v \in V$, where

$$\tau^D = \inf\{t > 0 : R_t \notin D\}.$$

- ▶ This affords new **parallelisable** opportunities to Monte-Carlo solve numerically for h :



can be replaced by



GENERATIONAL EVOLUTION AND k_{eff}

- ▶ In place of $(X_t, t \geq 0)$, we consider the process $(\mathcal{X}_n, n \geq 0)$, where, for $n \geq 1$, \mathcal{X}_n is $\mathcal{M}(D \times V)$ -valued and can be written

$$\mathcal{X}_n = \sum_{i=1}^{\mathcal{N}_n} \delta_{(r_i^{(n)}, v_i^{(n)})},$$

where $\{(r_i^{(n)}, v_i^{(n)}), i = 1, \dots, \mathcal{N}_n\}$ are the position-velocity configurations of the \mathcal{N}_n particles that are n -th in their genealogies to be the result of a fission event.

- ▶ \mathcal{X}_0 is consistent with X_0 and is the initial configuration of neutron positions and velocities.
- ▶ For $n \geq 1$ we can think of \mathcal{X}_n as the n -th generation of the system and we refer to them as the neutron generational process (NGP).

GENERATIONAL SEMIGROUP

- ▶ Appealing to the obvious meaning of $\langle g, \mathcal{X}_n \rangle$, define the expectation semigroup $(\Phi_n, n \geq 0)$ by

$$\Phi_n[g](r, v) = \mathbb{E}_{\delta_{(r,v)}} [\langle g, \mathcal{X}_n \rangle], \quad n \geq 0, r \in D, v \in V,$$

with $\Psi_0[g] := g \in L_\infty^+(D \times V)$.

- ▶ Associated eigen problem: finding a pair $\kappa > 0$ and $h \in L_\infty^+(D \times V)$ such that, pointwise,

$$\Phi_1[h](r, v) = \kappa h(r, v), \quad r \in D, v \in V.$$

- ▶ By splitting on the first fission event, Φ_n solves the following mild equation

$$\Phi_n[g](r, v) = \int_0^\infty Q_s [\mathcal{F}\Phi_{n-1}[g]](r, v) ds, \quad r \in D, v \in V, g \in L_\infty^+(D \times V),$$

where

$$Q_s[g](r, v) = \mathbb{E}_{\delta_{(r,v)}} \left[e^{-\int_0^s \sigma_\tau(R_u, \Upsilon_u) du} g(R_s, \Upsilon_s) \mathbf{1}_{(s < \tau_D)} \right],$$

and $(R_s, \Upsilon_s)_{s \geq 0}$ is the $\sigma_s \pi_s$ -NRW.

- ▶ If the pair (κ, h) solves (18), the strong Markov property along with an iteration implies that

$$\kappa^n h(r, v) = \Phi_n[h](r, v), \quad r \in D, v \in V.$$

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Theorem (Cox, Horton, K., Villemonais 2019)

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- ▶ $\inf_{r \in D, v, v' \in V} \sigma_F(r, v) \pi_F(r, v, v') > 0$.

Then for the semigroup $(\Phi_n, n \geq 0)$, there exist $k_{\text{eff}} \in \mathbb{R}$, a positive right eigenfunction $h \in L_\infty^+(D \times V)$ and a left eigenmeasure, \tilde{h} , on $D \times V$, both having associated eigenvalue k_{eff}^n . Moreover, k_{eff} is the leading eigenvalue in the sense that, for all $g \in L_\infty^+(D \times V)$,

$$\langle \tilde{h}, \Phi_n[g] \rangle = k_{\text{eff}}^n \langle \tilde{h}, g \rangle \quad (\text{resp. } \Phi_n[h] = k_{\text{eff}}^n h) \quad n \geq 0,$$

and there exists $\gamma > 1$ such that, for all $g \in L_\infty^+(D \times V)$,

$$\sup_{g \in L_\infty^+(D \times V): \|g\|_\infty \leq 1} \left\| k_{\text{eff}}^{-n} h^{-1} \Phi_n[g] - \langle \tilde{h}, g \rangle \right\|_\infty = O(\gamma^{-n}) \text{ as } n \rightarrow +\infty.$$

GENERATIONAL MAY-TO-ONE

- ▶ Let

$$m(r, v) = \int_V \pi_{\text{f}}(r, v, v') dv',$$

denote the mean number of offspring generated by a fission event at (r, v)

- ▶ Recall the $\alpha\pi$ -neutron random walk (R, Υ) where we define the rate α and the scatter kernel π so that

$$\alpha(r, v)\pi(r, v, v') = \sigma_{\text{s}}(r, v)\pi_{\text{s}}(r, v, v') + \sigma_{\text{f}}(r, v)\pi_{\text{f}}(r, v, v') \quad r \in D, v, v' \in V.$$

i.e.

$$\alpha(r, v) = \sigma_{\text{s}}(r, v) + \sigma_{\text{f}}(r, v)m(r, v)$$

- ▶ Recall that we can build an $\alpha\pi$ -NRW (R, Υ) that scatters at rate α and chooses its new velocity with π .

GENERATIONAL MAY-TO-ONE

- ▶ We can simulate its paths with the following subroutine:
 - ▶ (R, Υ) scatters for the k -th time at (r, v) with rate $\alpha(r, v)$;
 - ▶ A coin is tossed, $\mathbb{I}_k(r, v) = 1$ with probability $\sigma_{\varepsilon}(r, v)m(r, v)/\alpha(r, v)$, a new velocity, $\Theta_k^{\varepsilon}(r, v)$, is chosen with probability $\pi_{\varepsilon}(r, v, v')/m(r, v)$;
 - ▶ On the other hand, with probability density $\sigma_s(r, v)/\alpha(r, v)$ the random variable $\mathbb{I}_k(r, v) = 0$, a new velocity, $\Theta_k^s(r, v)$, is chosen with probability density $\pi_s(r, v, v')$.
- ▶ As such, the velocity immediately after the k -th scatter of the NRW, given that the position-velocity configuration immediately before is (r, v) , is coded by the random variable

$$\mathbb{I}_k(r, v)\Theta_k^{\varepsilon}(r, v) + (1 - \mathbb{I}_k(r, v))\Theta_k^s(r, v).$$

- ▶ We thus can identify sequentially, $T_0 = 0$ and, for $n \geq 1$,

$$T_n = \inf\{t > T_{n-1} : \Upsilon_t \neq \Upsilon_{t-} \text{ and } \mathbb{I}_{k_t}(R_t, \Upsilon_{t-}) = 1\},$$

where $(k_t, t \geq 0)$ is the process counting the number of scattering events of the NRW up to time t .

GENERATIONAL MAY-TO-ONE

Lemma

Suppose that

- ▶ The cross-sections $\sigma_s, \sigma_f, \pi_s$ and π_f are uniformly bounded away from infinity;
- ▶ We have $\sigma_s \pi_s + \sigma_f \pi_f > 0$ on $D \times V \times V$;
- ▶ There is an open ball B compactly embedded in D such that $\sigma_f \pi_f > 0$ on $B \times V \times V$.

Then the solution to

$$\Phi_n[g](r, v) = \int_0^\infty Q_s [\mathcal{F}\Phi_{n-1}[g]](r, v) ds, \quad r \in D, v \in V, g \in L_\infty^+(D \times V),$$

among the class of expectation semigroups is unique for $g \in L_\infty^+(D \times V)$ and the semigroup $(\Phi_n, n \geq 0)$ may alternatively be represented as

$$\Phi_n[g](r, v) = \mathbf{E}_{(r, v)} \left[\prod_{i=1}^n m(R_{T_i}, \Upsilon_{T_i-}) g(R_{T_n}, \Upsilon_{T_n}) \mathbf{1}_{(T_n < \kappa^D)} \right], \quad r \in D, v \in V, n \geq 1,$$

(with $\Phi_0[g] = g$), where $(R_t, \Upsilon_t)_{t \geq 0}$ is the $\alpha\pi$ -NRW, and

$$\kappa^D := \inf\{t > 0 : R_t \notin D\}.$$

k_{eff} -EIGENVALUE PROBLEM AND MC LOGIC

- ▶ there exists $\gamma > 1$ such that, “uniformly” for all $g \in L_{\infty}^{+}(D \times V)$,

$$\Phi_n[g](r, v) \sim k_{\text{eff}}^n h(r, v) \langle \tilde{h}, g \rangle + O(\gamma^{-n}) \text{ as } n \rightarrow +\infty,$$

suggesting an estimate over several “generations” of NRW

- ▶ But also

$$\frac{\langle \tilde{h}, \Phi_n[g] \rangle}{\langle \tilde{h}, g \rangle} = \frac{1}{\langle \tilde{h}, g \rangle} \int_{D \times V} \Phi_n[g](r, v) \tilde{h}(r, v) dr dv = k_{\text{eff}}^n$$

- ▶ In particular, this suggests an estimate over a single iteration by looking for stability:

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IMPORTANCE SAMPLING

- ▶ Note that we are wasting a lot of simulations to numerically develop the expectation

$$\Phi_1[g](r, v) = \mathbf{E}_{(r, v)} \left[m(R_{T_1}, \Upsilon_{T_1-}) g(R_{T_1}, \Upsilon_{T_1}) \mathbf{1}_{(T_1 < \kappa^D)} \right], \quad r \in D, v \in V, n \geq 1,$$

the indicator means we score zero for many runs of the MC.

- ▶ We can use a trick of Doob h -transforming (also known as importance sampling), which means we bias the characteristics of the NRW but average a different path function and arrange things so the averaging is still equal to $\Phi_1[g](r, v)$.

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- ▶ Suppose that $H(r, v)$ is a “good guess” of h . Then there exists a $\Gamma(r, v)$ such that

$$1 = \mathbf{E}_{(r,v)} \left[e^{-\int_0^{T_1} \Gamma(R_s, \Upsilon_s) ds} \frac{H(R_{T_1}, \Upsilon_{T_1})}{H(r, v)} \right], \quad r \in D, v \in V,$$

In fact, $\Gamma(r, v) = H^{-1}(r, v) \mathcal{L}H(r, v)$, where

$$\mathcal{L}f(r, v) = v \cdot \nabla f(r, v, t) + \alpha(r, v) \int_V (f(r, v', t) - f(r, v, t)) \pi(r, v, v') dv'.$$

- ▶ We “change measure”

$$\frac{d\mathbf{P}_{(r,v)}^H}{d\mathbf{P}_{(r,v)}} = e^{-\int_0^{T_1} \Gamma(R_s, \Upsilon_s) ds} \frac{H(R_{T_1}, \Upsilon_{T_1})}{H(r, v)}$$

- ▶ Then write Φ_1 in terms of \mathbf{P}^H ,

$$\Phi_1[g](r, v) = H(r, v) \mathbf{E}_{(r,v)}^H \left[e^{\int_0^{T_1} \Gamma(R_s, \Upsilon_s) ds} m(R_{T_1}, \Upsilon_{T_1}) \frac{g(R_{T_1}, \Upsilon_{T_1})}{H(R_{T_1}, \Upsilon_{T_1})} \right]$$

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- ▶ We can now build our MC sampling around a NRW (R, Υ) under \mathbf{P}^H .
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versus

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- ▶ Hence
 - ▶ **no simulating trees**
 - ▶ **no simulating NRW paths that leave the domain of the reactor** (i.e. every NRW path counts).
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Thank you!