

The Depoissonization Quintet
Poisson–Mellin–Newton–Rice–Laplace

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Plan of the talk

Two probabilistic models,
the [Bernoulli](#) model and the [Poisson](#) model.
with two tools,
the [Poisson transform](#), the [Poisson sequence](#).

Two “return” paths from the Poisson model to the Bernoulli model

- ▶ The first path : Depoissonization path with the Poisson transform.
- ▶ The second path : Rice path with the Poisson sequence.

Here, in this talk:

- ▶ Survey and comparison of the two paths
- ▶ Are they really different?
- ▶ It is true the Rice path be more restrictive to use?
- ▶ Study of the Rice path using the [Laplace](#) transform

I. General framework.

General framework.

Begin with (elementary) data

Consider algorithms which use as inputs finite sequences of data

If \mathcal{X} is the set of data, then the set of inputs is $\mathcal{X}^* = \bigcup_{n \geq 0} \mathcal{X}^n$

Context	(elementary) data	input	Study
source	a symbol from an alphabet	a (finite) word	entropy
text	an (infinite) word	a sequence of words	dictionary
geometry	a point	a sequence of points	convex hull

Probabilistic studies.

- ▶ The set \mathcal{X} is endowed with probability \mathbb{P}
- ▶ The set \mathcal{X}^N is endowed with probability $\mathbb{P}_{[N]}$

In cases (2) and (3), very often, the data are independently drawn with \mathbb{P}
Not in case (1) where the successive symbols may be strongly dependent.

Two probabilistic models.

Space of inputs := the set \mathcal{X}^* of the finite sequences x of elements of \mathcal{X} .
There are two main probabilistic models on the set \mathcal{X}^* .

- ▶ The **Bernoulli** model \mathcal{B}_n , where the cardinality N of the sequence x is fixed to n (then $n \rightarrow \infty$);
The Bernoulli model is **more natural** in algorithmics.

- ▶ The **Poisson** model \mathcal{P}_z of parameter z , where the cardinality N of the sequence x is a random variable that follows a Poisson law of parameter z ,

$$\Pr[N = n] = e^{-z} \frac{z^n}{n!},$$

(then $z \rightarrow \infty$). The Poisson model has nice probabilistic properties, notably **independence** properties \implies **easier to deal** with.

\implies A **first study** in the Poisson model,
followed with a **return** to the Bernoulli model

Average-case analysis of a cost R defined on \mathcal{X}^*
 $\mathcal{X}^* :=$ set of the finite sequences of elements of \mathcal{X}

- ▶ Final aim : Study the sequence $n \mapsto f(n)$,
 $f(n) := \mathbb{E}_{[n]}[R] :=$ the expectation in the Bernoulli model \mathcal{B}_n
- ▶ Consider the expectation $\mathbb{E}_z[R]$ in the Poisson model \mathcal{P}_z

$$\begin{aligned}\mathbb{E}_z[R] &= \sum_{n \geq 0} \mathbb{E}_z[R \mid N = n] \mathbb{P}_z[N = n] \\ &= \sum_{n \geq 0} \mathbb{E}_{[n]}[R] \mathbb{P}_z[N = n] = e^{-z} \sum_{n \geq 0} f(n) \frac{z^n}{n!}\end{aligned}$$

$\mathbb{E}_z[R]$ is the Poisson transform $P_f(z)$ of the sequence $n \mapsto f(n)$.

- ▶ With (properties of) the Poisson transform $P_f(z)$ of f
return to (the asymptotics of) the sequence $n \mapsto f(n)$

The Poisson transform and the Poisson sequence

With a sequence $f : n \mapsto f(n)$ [the expectations in the \mathcal{B}_n models],

we associate
$$P_f(z) = e^{-z} \sum_{k \geq 0} f(k) \frac{z^k}{k!} = \sum_{k \geq 0} (-1)^k \frac{z^k}{k!} p(k)$$

- ▶ The series $P_f(z)$ is the Poisson transform of $n \mapsto f(n)$, also the expectation in the Poisson model \mathcal{P}_z
- ▶ The sequence $k \mapsto p(k)$ is the Poisson sequence of $n \mapsto f(n)$. It is denoted by $\Pi[f]$. The map Π is involutive.

Important involutive binomial relation between $f(n)$ and $p(n)$

$$p(n) = \sum_{k=0}^n (-1)^k \binom{n}{k} f(k), \quad \text{and} \quad f(n) = \sum_{k=0}^n (-1)^k \binom{n}{k} p(k).$$

Description of the two possible paths.

Begin with a sequence $k \mapsto f(k)$ of polynomial growth,
consider its Poisson transform $P_f(z)$ and its Poisson sequence $\Pi[f] : n \mapsto p(n)$,

$$P_f(z) = e^{-z} \sum_{k \geq 0} f(k) \frac{z^k}{k!} = \sum_{n \geq 0} (-1)^n \frac{z^n}{n!} p(n)$$

Assume some “knowledge”

on the Poisson transform $P_f(z)$ or on the Poisson sequence $\Pi[f]$.

There are two paths for returning to the asymptotics of the initial sequence

- ▶ **Depoissonisation** method:
 - ▶ Deal with $P_f(z)$, find its asymptotics ($z \rightarrow \infty$) [tools à la Mellin]
 - ▶ Compare the asymptotics of the sequence $f(n)$ ($n \rightarrow \infty$)
to the asymptotics of $P_f(n)$
- ▶ **Rice** method
 - ▶ Deal with the sequence $\Pi[f]$
 - ▶ and its analytic lifting ψ which exists [tools à la Mellin-Rice].
 - ▶ Return to the sequence $n \mapsto f(n)$ via the binomial formula
which is transferred into the **Rice** integral.

II. An instance of application: tries and toll functions.

Tries

A source \mathcal{S} on a finite alphabet Σ $\mathcal{X} := \Sigma^{\mathbb{N}}$

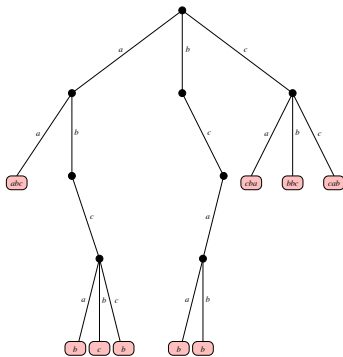
$\mathcal{X}^* := \{\text{sequences of words of } \Sigma^{\mathbb{N}} \text{ produced by a source } \mathcal{S}\}$

The trie $\mathcal{T}(x)$ built on $x \in \mathcal{X}^*$ is a tree :

- ▶ If $|x| = 0$, $\mathcal{T}(x) = \emptyset$
- ▶ If $|x| = 1$, $\mathcal{T}(x)$ is a leaf
- ▶ If $|x| \geq 2$, then $\mathcal{T}(x)$ is formed with
 - an internal node o
 - and a sequence of tries $\mathcal{T}(x_\sigma)$ for $\sigma \in \Sigma$

With $x := b(x) \cdot e(x) \in \Sigma^{\mathbb{N}}$, one associates

$x_\sigma = \epsilon$ ($b(x) \neq \sigma$), $x_\sigma := e(x)$ ($b(x) = \sigma$)



- ▶ Each internal node is labelled with a prefix w ,
- ▶ The associated subtrie deals with the words of x which begin with w .

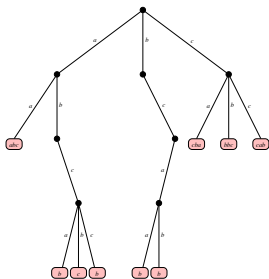
An instance of application: Toll functions and tries (II).

A sequence $n \mapsto f(n)$ with $\text{val}(f) \geq 2$ plays the role of a toll function.

With the toll f , associate the cost R defined on \mathcal{X}^*

$$R(x) := \sum_{w \in \Sigma^*} f(N_w(x)),$$

- ▶ $N_w(x)$ is the number of words of x which begin with the prefix w
- ▶ $f(N_w(x))$ is the toll “paid”
by the subtree whose root is labelled by w



$f(k) = 1 \implies R(x)$ is the **number of internal** nodes of $\mathcal{T}(x)$

$f(k) = k \implies R(x)$ is the **external path length** of $\mathcal{T}(x)$

Another instance (less classical) : $f(k) = k \log k \implies \dots$

$R(x)$ is the number of **symbol comparisons** performed by QuickSort on x .

What is the mean value of the cost $R(x)$ when $x \in \mathcal{X}^n$?

An instance of application: Toll functions and tries (III).

Study $r(n) :=$ the mean value of $R := \sum_{w \in \Sigma^*} f(N_w)$ in the \mathcal{B}_n model

The toll f gives its Poisson transform $P_f(z)$ and/or its sequence $\Pi[f]$

$$P_f(z) = e^{-z} \sum_{n \geq 2} f(n) \frac{z^n}{n!} = \sum_{n \geq 2} (-1)^n p_f(n) \frac{z^n}{n!}$$

The same for the cost R , with the sequence $r(n)$,

$$P_r(z) = e^{-z} \sum_{n \geq 2} r(n) \frac{z^n}{n!} = \sum_{n \geq 2} (-1)^n p_r(n) \frac{z^n}{n!}$$

For $w \in \Sigma^*$, $\pi_w :=$ the probability that a word begins with w
 N follows $\mathcal{P}_z \implies N_w$ follows $\mathcal{P}_{z \cdot \pi_w} \implies \mathbb{E}_z[f(N_w)] = P_f(z \pi_w)$

$$P_r(z) = \sum_{w \in \Sigma^*} P_f(z \pi_w) \quad p_r(n) = \left[\sum_{w \in \Sigma^*} \pi_w^n \right] p_f(n)$$

Sequence $f(n) \implies$ A good knowledge of $P_f(z)$ and/or $p_f(n)$

With the source \mathcal{S} and its $\pi_w \implies$ A good knowledge of $P_r(z)$ and/or $p_r(n)$

How to return to $r(n)$?

II – The Depoissonization path

Main contributors

- ▶ Haymann [1956]
- ▶ Jacquet and Szpankowski [1998] (two papers), Jacquet [2014]
- ▶ Hwang-Fuchs-Zacharovas [2010]

The **Depoissonization path** deals with the Poisson transform $P_f(z)$. It

- ▶ compares $f(n)$ and $P_f(n)$ with the **Poisson–Charlier** expansion

$$f(n) := \sum_{j \geq 0} \frac{P_f^{(j)}(n)}{j!} \tau_j(n), \quad \text{with } \tau_j(n) := n! [z^n] ((z-n)^j e^z)$$

- ▶ uses properties of the **Mellin** transform P_f^* for the asymptotics of P_f
- ▶ needs **depoissonization** sufficient conditions \mathcal{JS} on $P_f(z)$,
for **truncating** the Poisson-Charlier expansion
- ▶ obtains the asymptotics of $f(n)$.
- ▶ better **understands** the \mathcal{JS} conditions:

Theorem [Jacquet-Szpankowski] The two conditions are equivalent

- ▶ $P_f(z)$ satisfies the conditions \mathcal{JS}
- ▶ There is an analytical lifting $\varphi(z)$ for the sequence f of polynomial growth in a horizontal cone of angle θ_0 for some $\theta_0 > 0$.

III – The Rice path

Main contributors

- ▶ Norlünd, Norlünd-Rice [1929, 1954]
- ▶ Flajolet and Sedgewick [1995]

For a sequence $n \mapsto f(n)$ of polynomial growth,
the Rice path deals with the Poisson sequence $\Pi[f]$.

- ▶ It proves the existence of an **analytical lifting** ψ of the sequence $\Pi[f]$

$$\psi(s) = P_f^*(-s)/\Gamma(-s)$$

with the (direct) **Mellin** transform and **Newton** interpolation.

without any other condition on the sequence $n \mapsto f(n)$.

- ▶ If ψ is of **polynomial growth on the right** (for $\Re s \rightarrow \infty$),
the binomial relation is transferred into a **Rice** integral expression

$$f(n) = \frac{1}{2i\pi} \int_{a-i\infty}^{a+i\infty} L_n(s) \cdot \psi(s) ds$$

with the Rice kernel $L_n(s) = \frac{\Gamma(n+1)\Gamma(-s)}{\Gamma(n+1-s)} = B(n+1, -s)$.

- ▶ If ψ is **"tame"** [**meromorphic** and of **polynomial growth**] **on the left**,
a **shifting** to the left of the integral provides the asymptotics of $f(n)$.

$$\psi(s) = P_f^*(-s)/\Gamma(-s)$$

What are the sufficient conditions on the sequence f
which entail the **tameness** and **polynomial growth** of ψ ?

Not well studied ! Are they **true** in any **practical** situation ?

The main object of this talk.

Meromorphy is often easy to ensure, the poles are easy to find...

And **polynomial growth**?

- ▶ Holds (very often) for $P_f^*(s)$. But with the factor $1/\Gamma(s)$?
- ▶ Sometimes, in tries problems, the factor $\Gamma(s)$ appears in $P_f^*(s)$.

But what about other sequences, for instance $f(k) = k \log k$

- ▶ where the **depoissonization** path can be used.
- ▶ Is the Rice path **useful** in this case?
- ▶ Is it true that the Rice path is useful only for very specific cases?

We now answer these questions with the Laplace (inverse) transform.....

A new (easy) tool in the Rice path: Canonical sequence.

Definition. For a non zero real sequence $n \mapsto f(n)$

$$\deg(f) := \inf\{c \mid f(k) = O(k^c)\} \quad \text{val}(f) := \min\{k \mid f(k) \neq 0\}.$$

The sequence f is **reduced** if $\text{val}(f) = 0$ and $\deg(f) < -1$.

Reduced sequences are important in analyses à la Mellin.

With f , we associate a **canonical sequence** $\sigma(f)$ that is reduced, as follows:

Main tool: The shift T and its iterates T^ℓ ,

$$T[f](n) = \frac{f(n+1)}{n+1}, \quad T^\ell[f](n) = \frac{f(n+\ell)}{(n+1)\dots(n+\ell)}$$

Choose the smallest integer $\ell > d + 1$, the sequence $\sigma(f)$ defined as

$$\sigma(f)(n) := T^\ell[f](n), \quad \text{for } n \geq 1, \quad \sigma(f)(0) = 1$$

has degree $c := d - \ell < -1$ and valuation 0.

II **anticommutes** with $T \implies$ close relation between $\Pi[\sigma(f)]$ and $\Pi[f]$.

Strategy: we first deal with $\sigma(f)$ and $\Pi[\sigma(f)]$, then return to the initial f .

IV – The Rice–Laplace approach.

Consider a sequence F of **polynomial growth** (with Φ and Ψ)
and its canonical sequence f (with φ and ψ)

Two **general** steps on the canonical sequence f , with φ and ψ .

- When φ is of **polynomial growth on an half-plane**, we obtain an integral expression for $\psi(s)$ that involves the Inverse Laplace transform $\widehat{\varphi}$ of φ
- With a convenient **expansion** of $\widehat{\varphi}(u)$ at $u = 0$,
this ensures the tameness of ψ and thus the **tameness** of Ψ

A **third step**

- Find **sufficient conditions** on the initial sequence F
which entail such a convenient expansion for $\widehat{\varphi}(u)$ at $u = 0$.

The Rice-Laplace approach (I). A new integral expression for $\psi(s)$.

$$P_f(z) = e^{-z} \sum_{n \geq 0} f(n) \frac{z^n}{n!} = \sum_{n \geq 0} (-1)^n p(n) \frac{z^n}{n!}$$

Proposition. Consider a sequence $f : n \mapsto f(n)$ which

- (a) admits an **analytic** lifting φ on $\Re s > a$ with $a \in]-1, 0[$,
- (b) with the estimate $\varphi(s) = O(|s+1|^c)$ there with $c < -1$.

Then,

- (i) the function φ admits an inverse Laplace transform

$$\widehat{\varphi}(u) := \frac{1}{2i\pi} \int_{\Re s=b} \varphi(s) e^{su} ds \quad (b \in]a, 1])$$

on $]0, +\infty[$ of exponential decreasing as $u \rightarrow +\infty$

- (ii) The analytical lifting ψ of the sequence $\Pi[f]$ exists on $\Re s > -1$ and is expressed as an integral on the real line,

$$\psi(s) = \int_0^{+\infty} \widehat{\varphi}(u) \cdot (1 - e^{-u})^s du$$

The Rice–Laplace approach (II).

$$\psi(s) = \int_0^{+\infty} \widehat{\varphi}(u) (1 - e^{-u})^s du = \int_0^{+\infty} \widehat{\varphi}(u) u^s \left[\frac{1 - e^{-u}}{u} \right]^s du$$

- ▶ $\psi(s)$ is closely related to the Mellin transform $s \mapsto \widehat{\varphi}^*(s + 1)$.
- ▶ Tameness of ψ is related to the expansion of $u \mapsto \widehat{\varphi}(u)$ at $u = 0$.

We now **just** need a theorem which “**transfers**” the behaviour of φ into the behaviour of its inverse Laplace transform $\widehat{\varphi}(u)$ (at $u = 0$).

We do not know the existence of such a general transfer theorem.

This is why we exhibit a class of sequences F where such a transfer holds

The Rice–Laplace approach (III).

A particular class of interest : Basic sequences.

Definition. Consider a pair (d, b) with a real d and an integer $b \geq 0$.

A sequence F is **basic with pair (d, b)** if it admits on some halfplane $\Re s > a \geq 0$, an analytic extension of the form

$$\Phi(s) = s^d \log^b(s) W(1/s), \text{ with } W \text{ analytic at } 0, \text{ and } W(0) \neq 0.$$

Main Theorem. Consider a sequence F which admits on some halfplane $\Re s > a \geq 0$, an analytic extension of the form

$$\Phi(s) = s^d \log^b(s) W(1/s), \text{ with } W \text{ analytic at } 0, \text{ and } W(0) \neq 0.$$

Then, the analytic continuation $\Psi(s)$ of the $\Pi[F]$ sequence is of polynomial growth on any halfplane $\Re s \geq a > d$ and is tame at $s = d$.

Then, the Rice method can be applied in this case....

V. Comparison between the two paths Depoissonization and Rice-Laplace

Remind that the Depoissonization path deals with sequences whose analytic lifting is of **polynomial** growth inside **horizontal cones**.

We have described a precise framework for the Rice method, the Rice–Laplace method, that deals with sequences, whose analytic lifting admits a **precise** asymptotic expansion **on half-planes**.

- it exhibits an integral representation of the analytical lifting ψ of $\Pi[F]$;
- it proves the tameness of Ψ ;

Then, we have validated the **Rice path**

- in a **similar framework** to the Depoissonization framework;
- it is of more restricted use, but also easier to deal with.