## Lecture 6: Multivariate generating functions

### Robin Pemantle

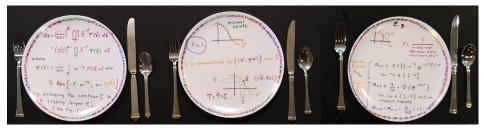
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Minerva Lectures at Columbia University

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# Dinner at the Pemutzle house



# Rational series: examples and phenomena

## One variable

#### Let

$$f(z) = \frac{p(z)}{q(z)} = \sum_{r \ge 0} a_r z^r$$

be a rational function.

Then f has a partial fraction expansion as a sum of terms of the form  $c(1 - tz)^d$  and therefore there is an exact expression for the coefficient  $a_r$ , namely

$$a_t = \sum_{(t,d,c)} c\binom{n+d}{d} t^r$$

summed over triples (t, d, c) in the partial fraction expansion. In short, the theory is trivial.

## Several variables

Now turn all the indices into multi-indices, which we denote by upper case letters:

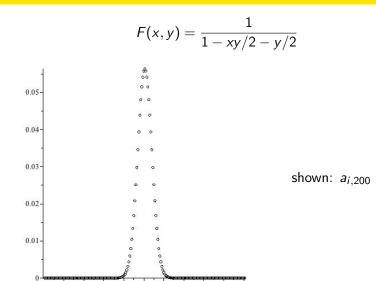
$$F(Z) = \frac{P(Z)}{Q(Z)} = \sum_{R} a_{R} Z^{R}.$$

Here, and throughout, this stands for

$$F(z_1,...,z_d) = \frac{P(z_1,...,z_d)}{Q(z_1,...,z_d)} = \sum_{r_1,...,r_d} a_{r_1,...,r_d} z_1^{r_1} \cdots z_d^{r_d}.$$

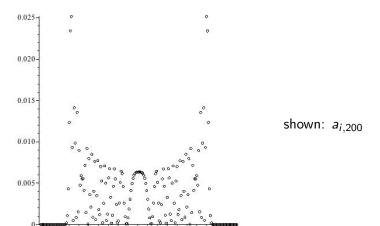
What phenomena are possible for the behavior of the multi-dimensional array  $\{a_R\}$ ?

## **Binomial coefficients**



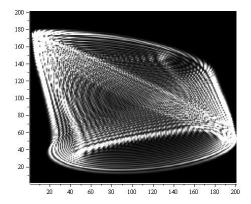
## 2-D quantum walk

$$F(x,y) = \frac{1}{1 - (1 - x)y/\sqrt{2} - xy^2}$$



## 3-D quantum walk

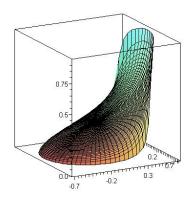
 $F(x, y) = \det(I - yMU)^{-1}$ , where M is a diagonal matrix of monomials and U is a real orthogonal matrix.



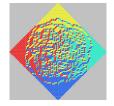
shown: grey scale plot of  $a_{i,j,200}$ 

## Dimer tiling

$$F(x,y) = \frac{z/2}{(1-yz)\left[1-(x+x^{-1}+y+y^{-1})z+z^2\right]}$$

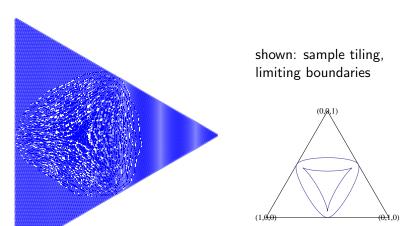


shown: plot of  $(r, s) \mapsto \lim_{t \to \infty} a_{rt, st, t}$ 



## Double-dimer tiling

 $F = P/Q \text{ where } Q(x, y, z) = 63x^2y^2z^2 - 62(x + y + z)xyz - (x^2y^2 + y^2z^2 + z^2x^2) + 62(xy + yz + zx) + (x^2 + y^2 + z^2) - 63 .$ 



## Possible behavior along a ray

Let  $R = |R| \cdot \hat{R}$  decompose R into magnitude and direction.

The possible behaviors<sup>1</sup> for  $a_R$  with  $\hat{R}$  roughly fixed are asymptotically, for some rational  $\beta$ , and nonnegative integer  $\gamma$ ,

$$a_R = C(\hat{R}) |R|^eta |\log(R)|^\gamma Z(\hat{R})^{-R}$$

Also possible: a finite sum of such terms.

Such formulae hold piecewise, with  $\beta$  and  $\gamma$  constant on each piece and C and Z varying analytically within each piece.

Phase boundaries are algebraic curves; One expects Airy-type behavior at the boundaries.

<sup>&</sup>lt;sup>1</sup>Precise statement not proved.

# Analytic framework

## Cauchy integral

Recall the one variable Cauchy integral

$$a_r = \frac{1}{2\pi i} \int z^{-r} f(z) \frac{dz}{z}$$

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## Cauchy integral

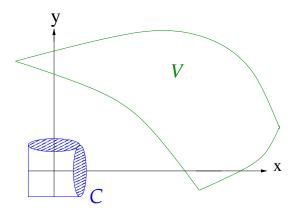
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- *dZ* is the holomorphic volume form;
- integrand is holomorphic in  $\mathcal{M} := \mathbb{C}^d \setminus \{Q \prod_{j=1}^d z_j = 0\};$
- C is a chain of integration topologically equivalent to the torus  $\prod_{j=1}^{d} \gamma_j$  where  $\gamma_j$  is a circle about the origin in the  $j^{th}$  coordinate and the equivalence is in  $H_d(\mathcal{M})$ .



 $\mathcal{M}$  is everything other than Vand the coordinate axes

## Two levels of accuracy

We want an asymptotic formula for  $\mathbf{a_r}$  as  $\mathbf{r} \to \infty$  with  $\mathbf{r}/|\mathbf{r}| \to \hat{\mathbf{r}}$ .

Two levels of accuracy, to be done in two steps:

- Exponential rate
- Asymptotic formula

To see how to execute these two steps, recall the univariate case.

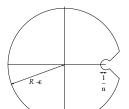
## Recall the univariate case

Step 1: let  $\rho$  be the radius of convergence.

$$\limsup \frac{\log \mathbf{a_n}}{\mathbf{n}} \le -\log \rho \,.$$

This completes step one.

<u>Step 2</u>: Use **singularity analysis**. Find the particular singularity  $z_*$  on the radius of convergence and integrate on a contour designed to capture behavior near  $z_*$ .



# Dominant singularity

## Logarithmic coordinates

Instead of a radius of convergence there is a different multi-radius in every direction.

The domain of convergence of a power series or Laurent series is a union of tori

$$\mathbf{T}_{\mathbf{X}} := \left\{ |\mathbf{z}_1| = \mathbf{e}^{\mathbf{x}_1}, \dots, |\mathbf{z}_{\mathbf{d}}| = \mathbf{e}^{\mathbf{x}_{\mathbf{d}}} \right\}.$$

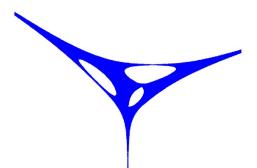
The set of  $\mathbf{X} \in \mathbb{R}^{d}$  for which a series converges is convex.

 $\begin{array}{l} \mathsf{Map}\ \mathbb{C}^{d} \ \mathsf{to}\ \mathbb{R}^{d} \ \mathsf{via} \ \mathsf{the} \ \mathsf{log-modulus} \ \mathsf{map} \\ (z_{1},\ldots,z_{d}) \mapsto (\mathsf{log}\ |z_{1}|,\ldots,\mathsf{log}\ |z_{d}|). \end{array}$ 

## Amoebas

The amoeba of  ${\bf Q}$  is the set  $\{\log |{\bf Z}|: {\bf Q}({\bf Z})=0\}$  where the log modulus map is taken coordinatewise.

On each component of the complement of the amoeba there is a convergent Laurent expansion  $\mathbf{P}/\mathbf{Q}=\sum_{\mathbf{R}}a_{\mathbf{R}}\mathbf{Z}^{\mathbf{R}}.$ 



Components of the amoeba complement (white regions) are convex.

## Imaginary fiber through a point on the boundary

Letting  $Z = \exp(X + iY)$  and sending X through a component of the complement, to a point on the boundary of the amoeba, the Cauchy integral becomes

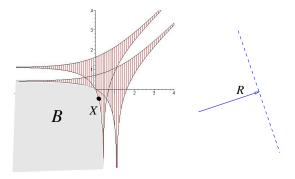
$$\mathbf{a}_{\mathbf{R}} = (2\pi \mathbf{i})^{-\mathbf{d}} \int \mathbf{Z}^{-\mathbf{R}} \mathbf{F}(\mathbf{Z}) \, \mathbf{d}\mathbf{Z}$$
$$= (2\pi)^{-\mathbf{d}} \mathbf{e}^{-\mathbf{R} \cdot \mathbf{X}} \int \exp(-\mathbf{i}\mathbf{R} \cdot \mathbf{Y}) \, \mathbf{f}(\mathbf{Y}) \, \mathbf{d}\mathbf{Y}$$

where f(Y) = F(exp(X+iY)).

## Legendre transform

Choose  $\mathbf{X} = \mathbf{X}_*$  to minimize the magnitude of the integrand.

For fixed  $\hat{\mathbf{R}}$ , this means to make  $-\hat{\mathbf{R}} \cdot \mathbf{X}_*$  as small as possible. This is a convex minimization problem (the Legendre transform).



*B* is a region of the complement corresponding to an ordinary power series;

 $\hat{R}$  is given;

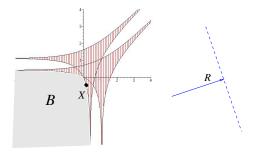
 $X_*$  is the minimizing point.

## Upper bound

The upper bound is immediate:

$$\limsup rac{1}{|R|} \log |a_R| \leq -\hat{R} \cdot X_*(R)$$

where  $X_*(R)$  is the support point on  $\partial B$  normal to R.



# Asymptotic evaluation

# Contributing points

We turn now to Step 2, namely the asymptotic evaluation of  $a_R$ . This is the only way to provide a matching lower bound (in fact the limsup and liminf behavior of the coefficients might not be the same).

Recall that every X in the amoeba of Q is  $\log |Z|$  for some at least one  $\mathbb{Z} \in \mathcal{V}$ . The Cauchy integral near *some* of these is what determines the asymptotics in direction R.

We next discuss the identification of point(s)  $\exp(X_* + iY) \in \mathcal{V}$  that are responsible for the coefficient asymptotics in direction R.

## Tangent cones

Finally... we get back to hyperbolicity.

Let  $T := \mathcal{V} \cap \{\exp(X_* + iY) : Y \in (\mathbb{R}/2\pi\mathbb{Z})^d\}.$ 

At each  $Z \in T$ , let  $p = p_Z$  be the homogeneous polynomial defined by the leading term of  $Q(Z + \cdot)$ .

The polynomial  $p_Z$  is the algebraic tangent cone of Q at Z.

#### Proposition (Baryshnikov+P 2011)

- 1. For every  $Z := \exp(X + iY)$  with X on the boundary of the amoeba of Q, the polynomial  $p_Z$  is hyperbolic.
- 2.  $p_Z$  has a cone of hyperbolicity containing the support cone B to the amoeba complement at X.

## Family of cones

This is the key construction for evaluating the Cauchy integral.

## Theorem (semi-continuous family of cones)

Let p be any hyperbolic homogeneous polynomial and let B be a cone of hyperbolicity for p. There is a family of cones K(x) indexed by the points x at which p vanishes, such that the following hold.

- (i) Each K(x) is a cone of hyperbolicity for the tangent cone  $p_x$ .
- (ii) All of the cones K(x) contain B.
- (iii) K(x) is semi-continuous in x, meaning that if  $x_n \to x$ , then  $K(x) \subseteq \liminf K(x_n)$ .

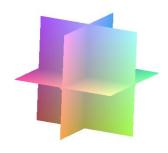
## Proof – examples to follow

Step 1: By the previous proposition  $p_x$  is hyperbolic. Now show that any vector hyperbolic for p is also hyperbolic for  $p_x$ . This result was originally proved by Atiyah-Bott-Gårding (1970); Borcea (personal communication) gave a short, self-contained proof.

Step 2: Pick u in B. Define K(x) to be the cone of hyperbolicity of  $p_x$  that contains u. This gives (*i*) and also (*ii*) because the construction is the same for any  $u \in B$ .

Step 3: Prove (*iii*) by showing that these cones obey a condition similar to that of Whitney stratification. This takes a few geometric steps.

## Example: orthant

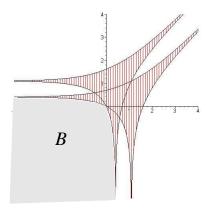


If x is on a 2-D surface then K(x) is the halfspace containing B.

If x is on one of the intersection lines then K(x) is the quarter-space containng B.

If x is the origin then then K(x) is the octant B.

## Example: product of two linear polynomials

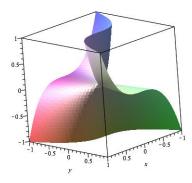


If x = 1, the common intersection of the two divisors, then K(x) = B.

If x is on only one of the lines then K(x) is a halfspace tangent to one of the two factor amoebas.

Shown: the amoeba for p = (3z - x - 2y)(3z - 2x - y). The amoeba of the product is the union of the two factor amoebas.

## Counterexample: when p is not hyperbolic



Along the line (0, y, 0), K(y)cones of hyperbolicity for  $p_y$ can be chosen but are forced to select the positive or negative *z* direction.

One of these violates semicontinuity for  $K(0^+, y, 0)$  while the other choice violates semicontinuity at  $K(0^-, y, 0)$ .

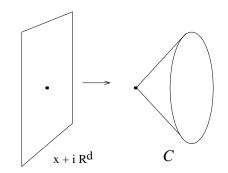
## Semi-continuous cones give vector field

### Theorem (Morse deformation; BP2011, after ABG1970)

If  $\{K(x)\}$  is a semi-continuous family of cones, then a continuous vector field  $\Psi$  may be constucted with  $\Psi(x) \subseteq K(x)$  for each x.

This allows the chain of integration for the Cauchy integral to be deformed so that the integrand is very small except in a neighborhood of Z.

The deformation is locally projective.



## The Cauchy integral and the Riesz kernel

Recall the integral in logarithmic coordinates

$$a_R = (2\pi)^{(1-d)/2} \exp(-R \cdot X) \int \exp(-(iR \cdot Y)f(Y) \, dY \, .$$

Pushing the chain of integration from the imaginary fiber outward in a conical manner produces a homogeneous inverse Fourier transform.

Leading asymptotic behavior only depends on leading behavior of the homogenization  $1/p_Z$ . We recognize the IFT

$$\int_{\gamma} p_z^{-1} \exp(iR \cdot Y)$$

as the Riesz kernel for the homogeneous hyperbolic polynoimal  $p_z$ .

## Inverse Fourier transforms

The estimates needed to establish the existence of the integral rely on the projective deformation.

Relating it to previously computed IFT's (in, e.g., [ABG1970]) uses the theory of **boundaries of holomorphic functions**, laid out by Hörmander (1990).

For example, the IFT of a linear function ax + by + cz is a delta function on the ray  $\lambda \langle a, b, c \rangle$  in the dual space. (Here the index space  $\mathbb{Z}^d$  is the dual space and the real/complex space in which the generating function variables live is the primal space.)

## Examples of computed IFT's

### Example (orthant)

The IFT of 1/(xyz) is the constant 1 on the orthant. This corresponds to the generating function

$$\frac{1}{(1-x)(1-y)(1-z)}$$



## Quadratic times linear

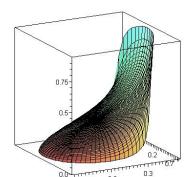
"Quadratic times linear" describes the homogeneous part of the Aztec Diamond probability generating function

$$\frac{z/2}{(1-yz)\left[1-(x+x^{-1}+y+y^{-1})z+z^2\right]}$$

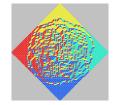


## Example: Aztec diamond tilings

IFT is a convolution of a delta function on the ray  $(0, \lambda, \lambda)$  with the IFT of a circular quadratic. The quadratic is self-dual, with IFT equal to  $t^2 - r^2 - s^2$ .



shown: plot of  $(r, s) \mapsto \lim_{t \to \infty} a_{rt, st, t}$ 

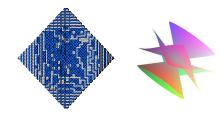




Inverse Fourier transforms for general hyperbolic homogeneous polynomials have not been effectively computed although quite a number have been worked out, e.g., Atiyah-Bott-Gårding (Acta Math. 1970) "Lacunas for hyperbolic differential operators with constant coefficients, I."

## More to be done

General cubic and quartic integrals are a little trickier to evaluate explicitly than are the quadratics and factored cubics. The so-called fortress tillings are an example of this (work in progress with Y. Baryshnikov).





This cubic arises in analysis of the hexahedron recurrence. Its IFT gives a limit shape theorem (work in progress). At present we can describe the feasible region but not the limit statistics within the region. For a particular parameter value, the central collar becomes a plane and the results for Quardatic times Linear apply.



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Analytic Combinatorics in Several Variables

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