# An Introduction to Analytic Combinatorics

Meeting on Discrete Structures Dec. 17, 2015

> Bruno Salvy @AriC

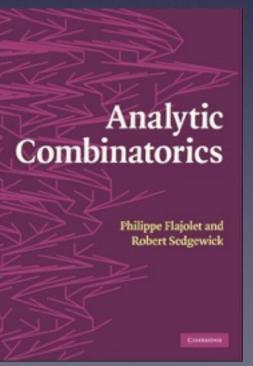


# An Introduction to Analytic Combinatorics

#### Meeting on Discrete Structures Dec. 17, 2015

Bruno Salvy @AriC





#### Combinatorics, Randomness and Analysis

From simple local rules, a global structure arises.

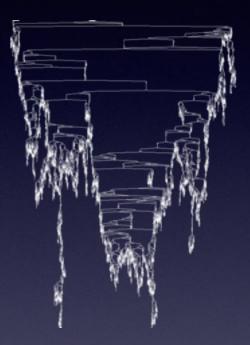
120

40

A quest for universality in random discrete structures:
→ probabilistic complexity of structures and algorithms.

Quantitative results using complex analysis.

Ex.: binary trees



#### Ex.: binary trees

Equations over combinatorial structures

 $|\mathcal{B} = \mathcal{Z} \cup \mathcal{B} imes \mathcal{B}|$ 

#### Ex.: binary trees

Equations over combinatorial structures

Generating functions

$$F(z) = \sum_{n=0}^{\infty} f_n z^n$$



 $\mathcal{B} = \mathcal{Z} \cup \mathcal{B} \times \mathcal{B}$  $B(z) = z + B(z)^2$ 

Ex.: binary trees

Equations over combinatorial structures

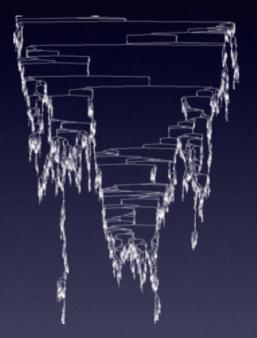
Generating functions

 $F(z) = \sum_{n=0}^{\infty} f_n z^n$ • Complex analysis

$$f_n \sim \cdots, n \to \infty$$

 $\mathcal{B} = \overline{\mathcal{Z} \cup \mathcal{B} \times \mathcal{B}}$  $B(z) = z + B(z)^2$ 

Ex.: path length in binary trees



Ex.: path length in binary trees

 Equations over combinatorial structures + parameters



- Equations over combinatorial structures + parameters
- Multivariate generating series

$$F(z,u) = \sum_{n,k} f_{n,k} u^k z^n$$

Ex.: path length in binary trees



$$B(z, u) = \sum_{t \in T} u^{\mathrm{pl}(t)} z^{|t|}$$
$$= z + B^2(zu, u)$$
$$P(z) := \frac{\partial}{\partial u} B(z, u) \Big|_{u}$$

- Equations over combinatorial structures + parameters
- Multivariate generating series

$$F(z,u) = \sum_{n,k} f_{n,k} u^k z^n$$

• Complex analysis

$$f_{n,k} \sim \cdots, n \to \infty$$

Ex.: path length in  
binary trees  
$$B(z, u) = \sum_{t \in T} u^{\text{pl}(t)} z^{|t|}$$
$$= z + B^2(zu, u)$$
$$P(z) := \frac{\partial}{\partial u} B(z, u) \Big|_{u=1}$$
$$B_n \sim \frac{4^{n-1}n^{-3/2}}{\sqrt{\pi}}$$
$$P_n \sim 4^{n-1}$$
$$\frac{P_n}{n} \sim \sqrt{\pi n}$$

l l D n

- Equations over combinatorial structures + parameters
- Multivariate generating series

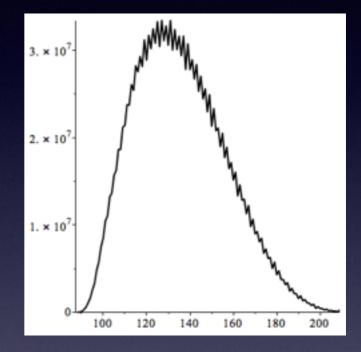
$$F(z,u) = \sum_{n,k} f_{n,k} u^k z^n$$

• Complex analysis

$$f_{n,k} \sim \cdots, n \to \infty$$

Limiting distribution

Ex.: path length in binary trees



$$B_n \sim \frac{4^{n-1}n^{-3/2}}{\sqrt{\pi}}$$
$$P_n \sim 4^{n-1}$$
$$\frac{P_n}{B_n} \sim \sqrt{\pi n}$$

# I. From Combinatorics to Generating Functions

Language:  $1, \mathcal{X}, +, X, SEQ$ , SET, CYC and recursion.



**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

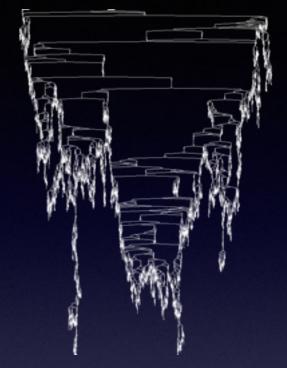
Binary trees: B=I+I×B×B



**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

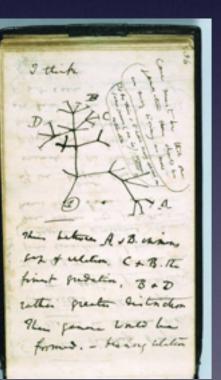
Binary trees: B=I+I×B×B

• Permutations:  $Perm=Set(CYC(\mathcal{Z}));$ 



**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

Binary trees: B=I+I×B×B



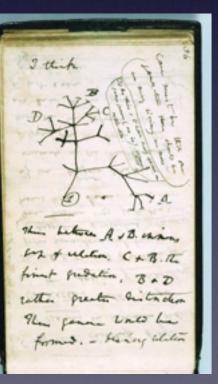
Permutations:  $Perm=Set(CYC(\mathcal{Z}));$ 

• Trees:  $\mathcal{T} = \mathscr{X}SET(\mathcal{T}(\mathscr{X}));$ 



**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

Binary trees: B=I+I×B×B



Permutations:  $Perm=Set(CYC(\mathcal{Z}));$ 

• Trees:  $\mathcal{T} = \mathscr{Z} \times SET(\mathcal{T}(\mathscr{Z}));$ 

• Functional graphs:  $\mathcal{F}$ =SET(CYC( $\mathcal{T}(\mathcal{Z})$ ));



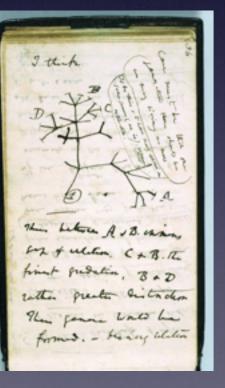
**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

Binary trees: *B*=*I*+*I*×*B*×*B* 

Permutations:  $Perm=SET(CYC(\mathcal{Z}));$ 

• Trees:  $\mathscr{T} = \mathscr{Z} \times SET(\mathscr{T}(\mathscr{Z}));$ 





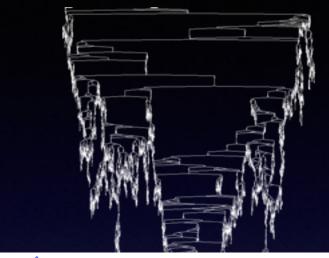
Functional graphs: F=SET(CYC(T(I)));
 Series-parallel graphs:

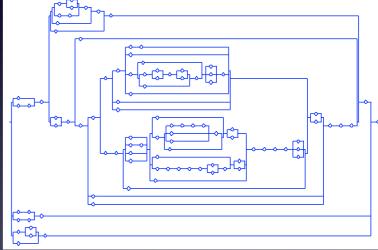
**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

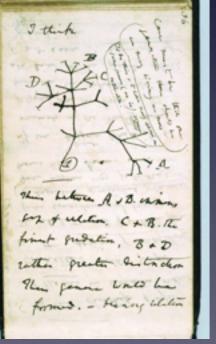
Binary trees: B=I+I×B×B

Permutations:  $Perm=SET(CYC(\mathcal{Z}));$ 

• Trees:  $\mathscr{T} = \mathscr{Z} \times SET(\mathscr{T}(\mathscr{Z}));$ 







 Functional graphs: ℱ=SET(CYC(𝒯(𝒯)));
 Series-parallel graphs: 𝔅=𝒴+𝔅+𝔅, 𝔅=SEQ<sub>>0</sub>(𝒴+𝔅),𝔅=SET<sub>>0</sub>(𝒴+𝔅);

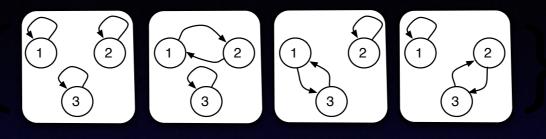
…hundreds of examples in "the purple book".



hilippe Flajolet a Robert Sedrewi

6 / 26

#### Two kinds of Generating Functions



4 involutions;

3 of them permuted by  $\mathfrak{S}_3 \rightarrow 2$  unlabelled structures.

#### **Exponential generating function:**

$$\mathsf{F}(\mathsf{z}) = \sum_{\mathsf{n}=0}^{\infty} \mathsf{f}_{\mathsf{n}} \frac{\mathsf{z}^{\mathsf{n}}}{\mathsf{n}!}, \qquad \mathsf{f}_{\mathsf{n}} = \mathsf{n}\mathsf{b}. \text{ labelled structs of size } n. \quad \mathrm{Inv}_3(\mathsf{z}) = \frac{2}{3}\mathsf{z}^3$$

**Ordinary generating function:** 

$$\tilde{F}(z) = \sum_{n=0}^{\infty} \tilde{f}_n z^n, \qquad \tilde{f}_n = nb. \text{ unlabelled of size } n. \qquad \widetilde{\mathrm{Inv}}_3(z) = 2z^3$$

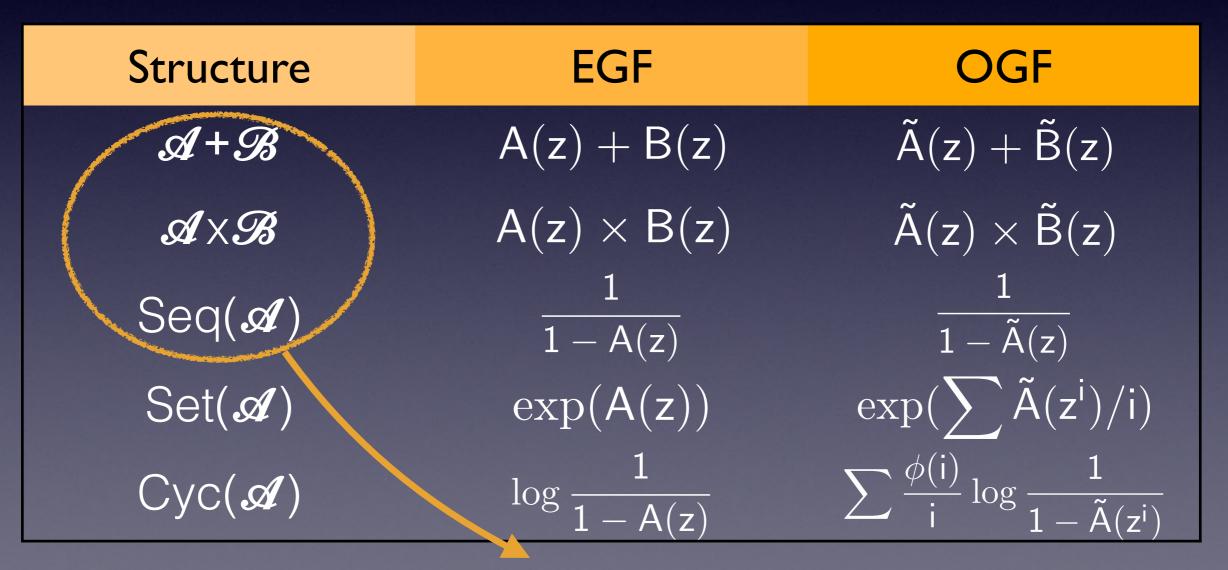
#### A Dictionary for Generating Functions

**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.

Structure	EGF	OGF
$\mathcal{A}+\mathcal{B}$	A(z) + B(z)	$\tilde{A}(z) + \tilde{B}(z)$
$\mathscr{A} \times \mathscr{B}$	$A(z) \times B(z)$	$\tilde{A}(z)\times\tilde{B}(z)$
Seq(A)	$\frac{1}{1-A(z)}$	$\frac{1}{1-\tilde{A}(z)}$
Set( <i>A</i> )	$\exp(A(z))$	$\exp(\sum \tilde{A}(z^i)/i)$
$Cyc(\mathscr{A})$	$\log \frac{1}{1 - A(z)}$	$\sum \frac{\phi(i)}{i} \log \frac{1}{1 - \tilde{A}(z^{i})}$

#### A Dictionary for Generating Functions

**Language**:  $1, \mathcal{X}, +, \times, SEQ$ , SET, CYC and recursion.



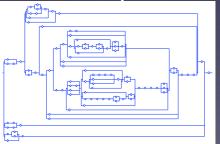
Regular and context-free languages.

# Examples

Binary trees:  $\mathcal{B} = \mathcal{Z} + \mathcal{Z} \times \mathcal{B} \times \mathcal{B}$  $\longrightarrow B(z) = z + zB(z)^2 = \tilde{B}(z)$ 

Cayley trees: 
$$\mathcal{T} = \mathcal{Z} \times \text{SET}(\mathcal{T})$$
  
 $\longrightarrow T(z) = z \exp(T(z));$   
 $\longrightarrow \tilde{T}(z) = z \exp\left(\tilde{T}(z) + \frac{1}{2}\tilde{T}(z^2) + \frac{1}{3}\tilde{T}(z^3) + \cdots\right)$ 

Series-parallel graphs:



 $\mathcal{G} = \mathcal{Z} + \mathcal{S} + \mathcal{P}, \mathcal{S} = \operatorname{SEQ}_{>0}(\mathcal{Z} + \mathcal{P}), \mathcal{P} = \operatorname{SET}_{>0}(\mathcal{Z} + \mathcal{S})$  $\longrightarrow \left\{ G(z) = z + S(z) + P(z), S(z) = \frac{1}{1 - z - P(z)} - 1, P(z) = e^{z + S(z)} - \frac{1}{9} \right\}_{26}$ 

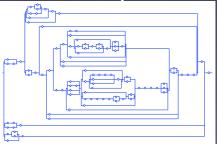
# Examples

Binary trees:  $\mathcal{B} = \mathcal{Z} + \mathcal{Z} \times \mathcal{B} \times \mathcal{B}$  $\longrightarrow B(z) = z + zB(z)^2 = \tilde{B}(z)$ 

Cayley trees:  $\mathcal{T} = \mathcal{Z} \times \operatorname{Set}(\mathcal{T})$  $\longrightarrow T(z) = z \exp(T(z));$ 

 $\longrightarrow \tilde{T}(z) = z \exp\left(\tilde{T}(z) + \frac{1}{2}\tilde{T}(z^2) + \frac{1}{3}\tilde{T}(z^3) + \cdots\right)$ 

Series-parallel graphs:



 $\overline{\mathcal{G}} = \overline{\mathcal{Z}} + \overline{\mathcal{S}} + \overline{\mathcal{P}}, \overline{\mathcal{S}} = \operatorname{SEQ}_{>0}(\overline{\mathcal{Z}} + \overline{\mathcal{P}}), \overline{\mathcal{P}} = \operatorname{SET}_{>0}(\overline{\mathcal{Z}} + \overline{\mathcal{S}})$  $\longrightarrow \left\{ G(z) = z + S(z) + P(z), S(z) = \frac{1}{1 - z - P(z)} - 1, P(z) = e^{z + S(z)} - \frac{1}{9} \right\}_{26}$ 

# II. Mini-introduction to complex analysis

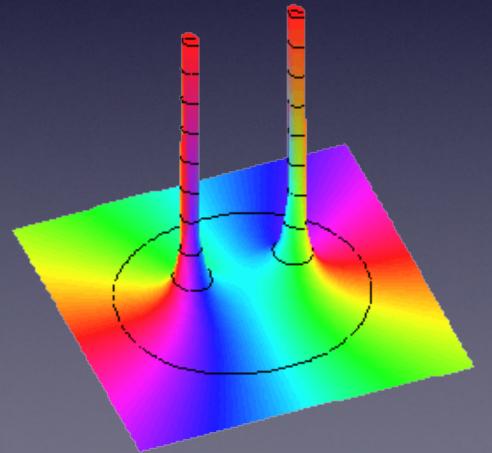
#### **Basic Definitions and Properties**

- **Def.** *f*:  $D \subset \mathbb{C} \to \mathbb{C}$  is analytic at *a* if it is the sum of a power series in a disk around *a*.
- **Prop.** *f*,*g* analytic at *a*, then so are *f*+*g*, *f*x*g*, *f*'.
- g analytic at a, f analytic at g(a), then  $f_{\circ}g$  analytic at a.
- Same def and prop in *several variables*.

# Examples

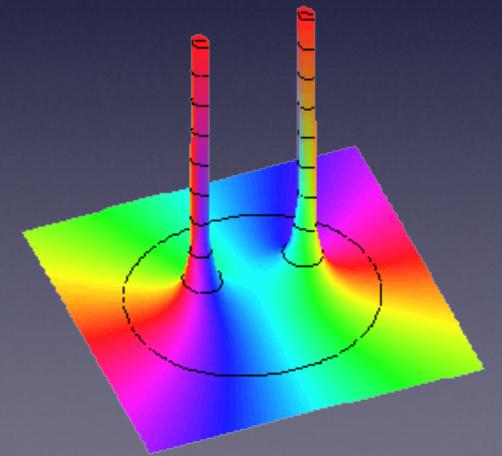
f	analytic at 0?	why
polynomial	Yes	
$\exp(x)$	Yes	$1 + x + x^2/2! + \cdots$
$\frac{1}{1-x}$	Yes	$1 + x + x^2 + \cdots ( x  < 1)$
$\log \frac{1}{1-x}$	Yes	$x + x^2/2 + x^3/3 \cdots ( x  < 1)$
$\frac{\log \frac{1}{1-x}}{\frac{1-\sqrt{1-4x}}{2x}}$	Yes	$1 + \dots + \frac{1}{k+1} \binom{2k}{k} x^k + \dots ( x  < 1/4);$
$\frac{1}{x}$		infinite at 0
$\log x$		derivative not analytic at 0
$\sqrt{x}$		derivative infinite at 0

- Def. Analytic in a region (= connected, open, ≠ø): at each point.
- Prop. f analytic in RcS. There is at most one analytic function in S equal to f on R (the analytic continuation of f to S.)



- Def. Analytic in a region (= connected, open, ≠ø): at each point.
- Prop. *f* analytic in *R*⊂*S*. There is at most one analytic function in *S* equal to *f* on *R* (the analytic continuation of *f* to *S*.)

More Defs.



- Def. Analytic in a region (= connected, open, ≠ø): at each point.
- Prop. *f* analytic in *R*⊂*S*. There is at most one analytic function in *S* equal to *f* on *R* (the analytic continuation of *f* to *S*.)

More Defs. Singularity: a point that cannot be reached by analytic continuation;

- Def. Analytic in a region (= connected, open, ≠ø): at each point.
- Prop. *f* analytic in *R*⊂*S*. There is at most one analytic function in *S* equal to *f* on *R* (the analytic continuation of *f* to *S*.)

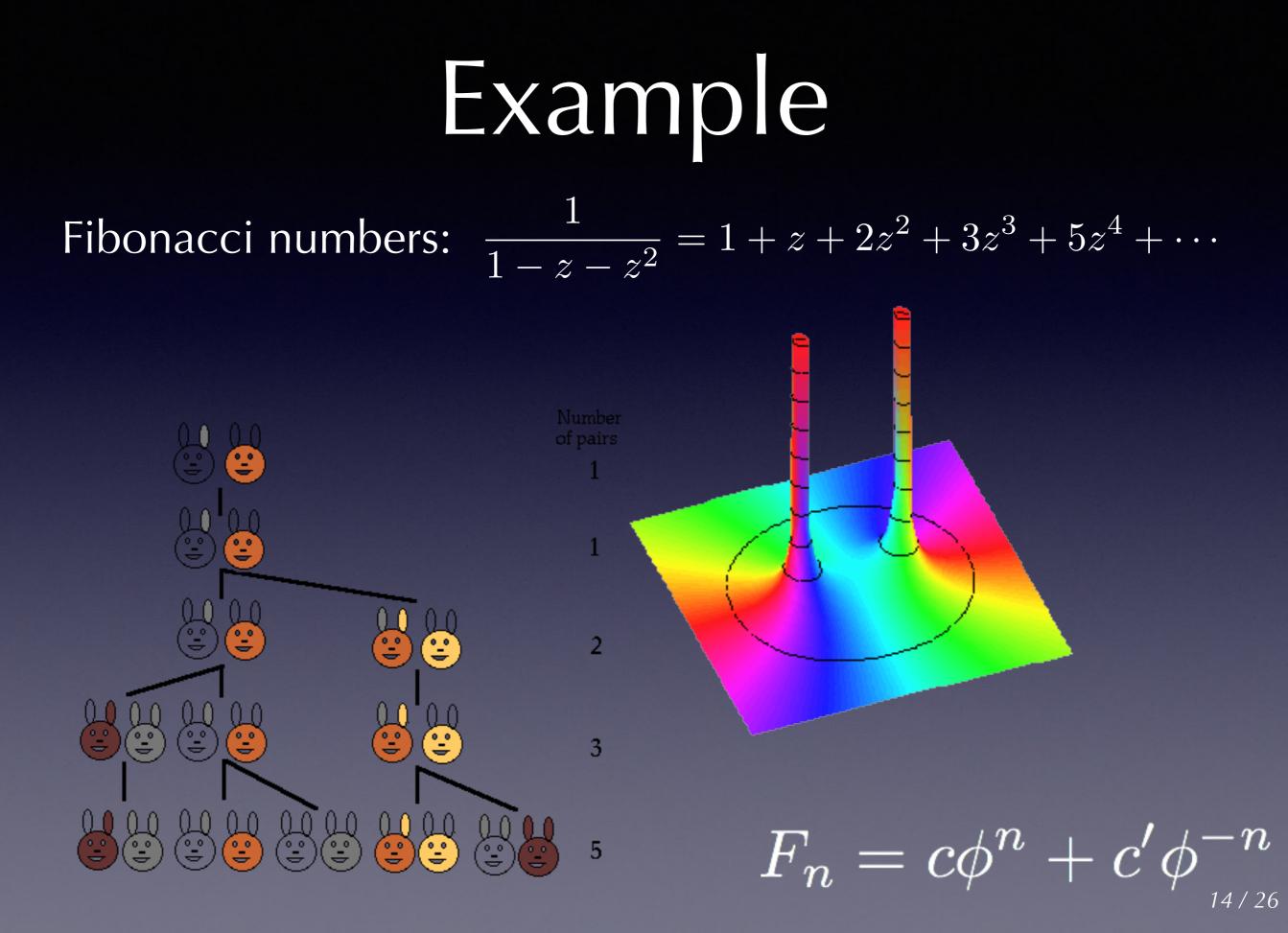
More Defs. Singularity: a point that cannot be reached by analytic continuation; Pole: isolated singularity a and  $(z-a)^m f$ analytic for some  $m \in \mathbb{N}$ ;

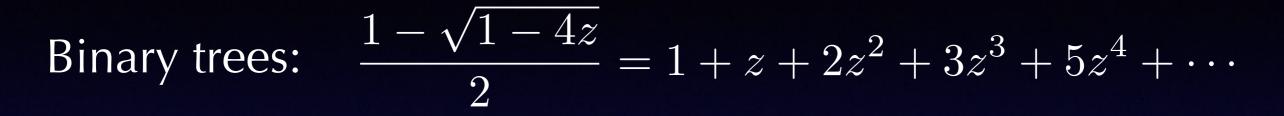
- Def. Analytic in a region (= connected, open, ≠ø): at each point.
- Prop. *f* analytic in *R*⊂*S*. There is at most one analytic function in *S* equal to *f* on *R* (the analytic continuation of *f* to *S*.)

More Defs. Singularity: a point that cannot be reached by analytic continuation; Pole: isolated singularity a and  $(z-a)^m f$ analytic for some  $m \in \mathbb{N}$ ; Residue at a pole a: coeff of  $(z-a)^{-1}$ ;

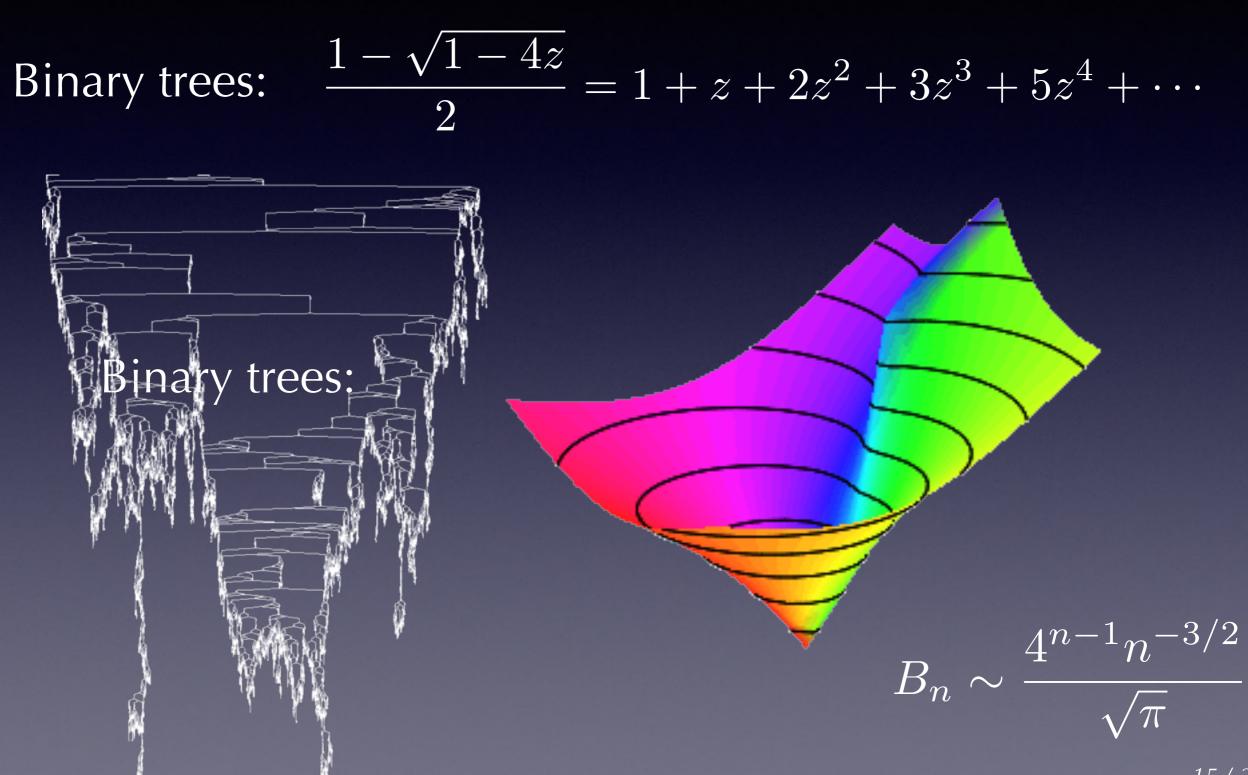
- Def. Analytic in a region (= connected, open, ≠ø): at each point.
- Prop. *f* analytic in *R*⊂*S*. There is at most one analytic function in *S* equal to *f* on *R* (the analytic continuation of *f* to *S*.)

More Defs. Singularity: a point that cannot be reached by analytic continuation; Pole: isolated singularity a and  $(z-a)^{m}f$ analytic for some  $m \in \mathbb{N}$ ; Residue at a pole a: coeff of  $(z-a)^{-1}$ ; f meromorphic in R: only polar singularities.







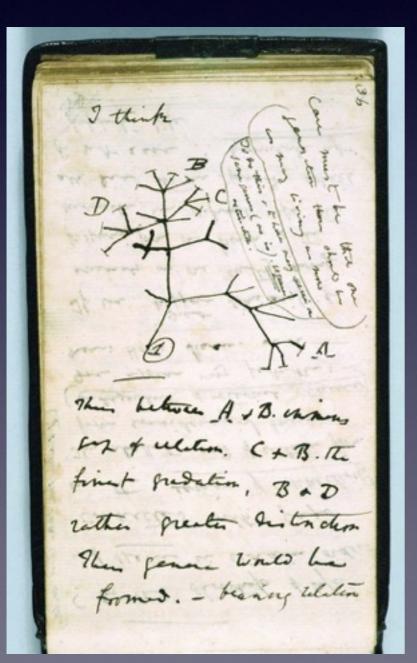


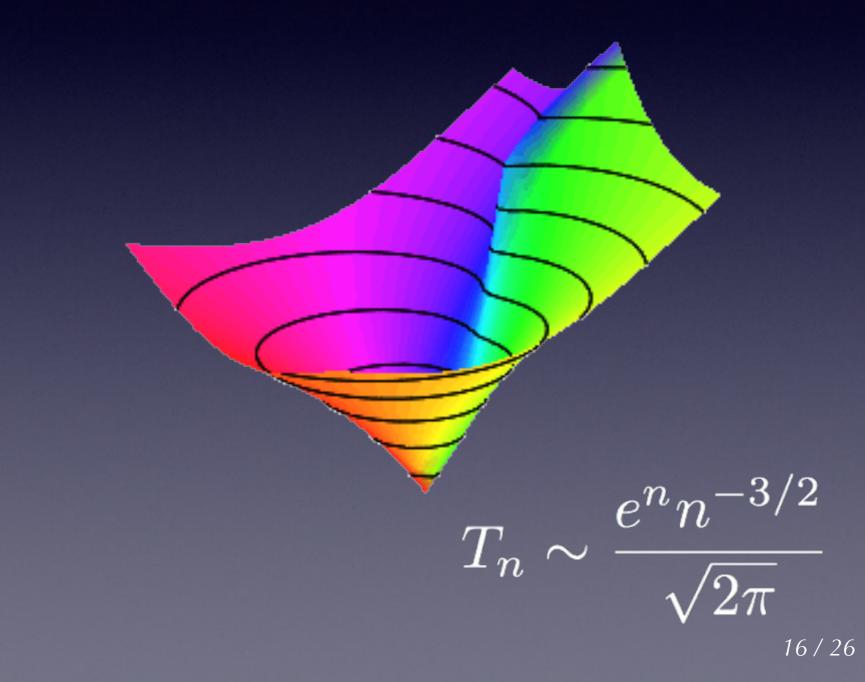
#### Cayley trees: $T(z) = z \exp(T(z)) = z + 2\frac{z^2}{2!} + 9\frac{z^3}{3!} + 64\frac{z^4}{4!} + \cdots$

I think The between A & B. chinas son of ulation. C+B. The finit qualition, B + D rather greater hitrolen The genne world be formed . - being whiten

 $T_n \sim \frac{e^n n^{-3/2}}{\sqrt{2\pi}}$ 

#### Cayley trees: $T(z) = z \exp(T(z)) = z + 2\frac{z^2}{2!} + 9\frac{z^3}{3!} + 64\frac{z^4}{4!} + \cdots$





# Integration

**Prop.** f meromorphic in a region R,  $\gamma$  a closed path in  $\mathbb{C}$  encircling the poles  $a_1, \ldots, a_m$  of f once in the positive sense. Then

$$\int_{\gamma} f(z) \, dz = 2\pi i \sum_{j} \operatorname{Res}(f; a_j).$$

X

X

(x)

 $(\mathcal{X})$ 

## Integration

**Prop.** f meromorphic in a region R,  $\gamma$  a closed path in **C** encircling the poles  $a_1, \ldots, a_m$  of f once in the positive sense. Then

$$\int_{\gamma} f(z) \, dz = 2\pi i \sum_{j} \operatorname{Res}(f; a_j).$$

**Cor**. If  $f = a_0 + a_1 z + \cdots$  is analytic in R $\ni$ 0, then

$$\mathsf{a_n} = \frac{1}{2\pi\mathsf{i}} \int_\gamma \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$$

for any closed *y* encircling 0 once in the positive sense.

X

X

 $(\mathbf{x})$ 

 $(\mathcal{X})$ 

# III. From Generating Functions to Asymptotic Behaviour

Philosophy:

Smallest singularity ↔ exponential behaviour local behaviour ↔ subexponential terms

3 families cover most applications

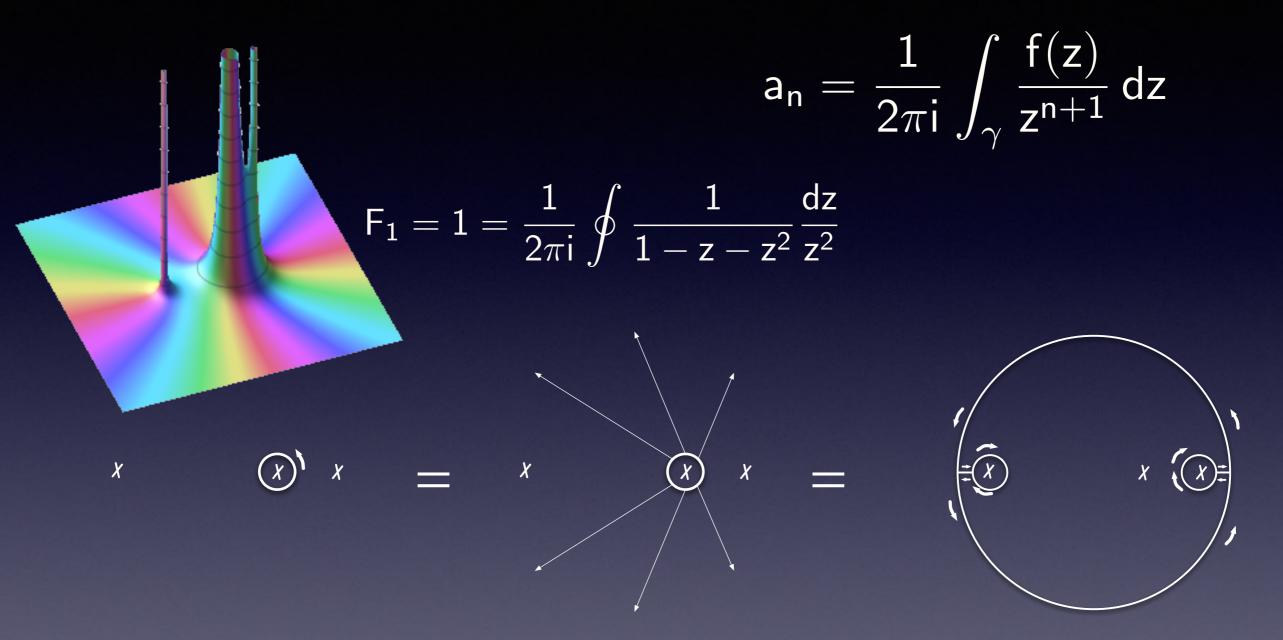
$$a_n = \frac{1}{2\pi i} \int_{\gamma} \frac{f(z)}{z^{n+1}} dz$$

$$F_1 = 1 = \frac{1}{2\pi i} \oint \frac{1}{1-z-z^2} \frac{dz}{z^2}$$

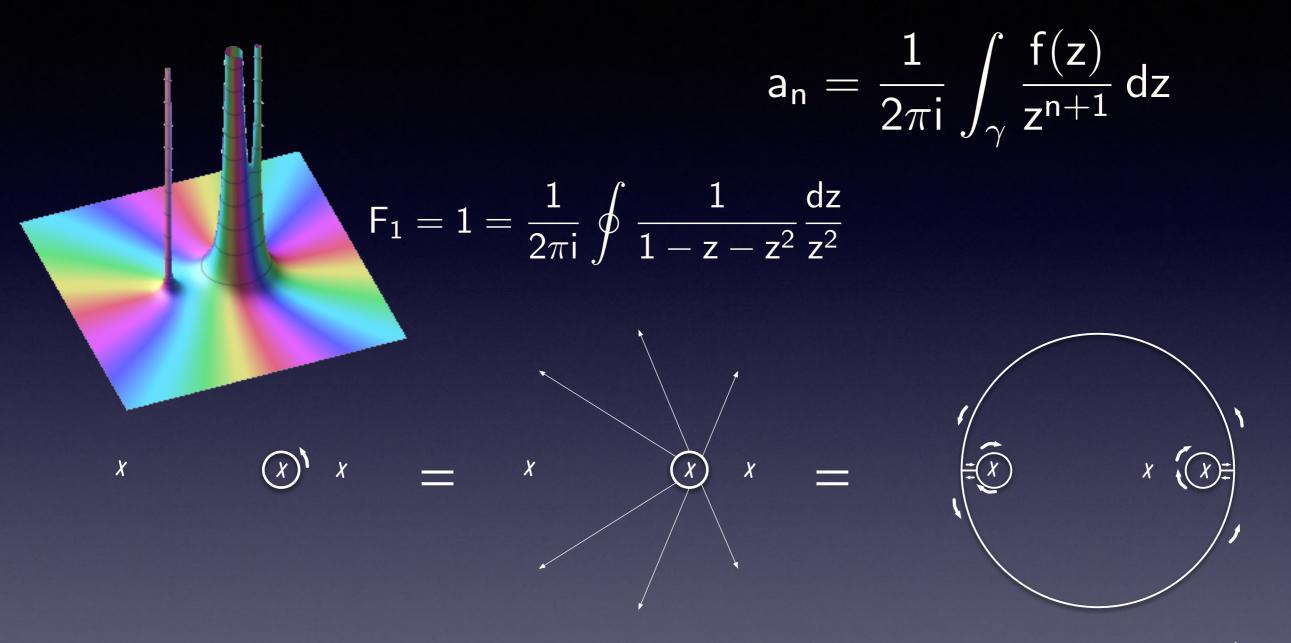
$$a_{n} = \frac{1}{2\pi i} \int_{\gamma} \frac{f(z)}{z^{n+1}} dz$$

$$F_{1} = 1 = \frac{1}{2\pi i} \oint \frac{1}{1-z-z^{2}} \frac{dz}{z^{2}}$$

As n increases, the smallest singularities dominate.



As n increases, the smallest singularities dominate.



As n increases, the smallest singularities dominate.

 $\mathsf{F}_{\mathsf{n}} = \frac{\phi^{-\mathsf{n}-1}}{1+2\phi} + \frac{\overline{\phi}^{-\mathsf{n}-1}}{1+2\overline{\phi}}$ 

1,11,21,1211,111221,...

1,11,21,1211,111221,...

Generating function for lengths: f(z)=P(z)/Q(z)

1,11,21,1211,111221,...

Generating function for lengths: f(z)=P(z)/Q(z)with deg Q=72.

1,11,21,1211,111221,...

Generating function for lengths: f(z)=P(z)/Q(z) \* with deg Q=72.



1,11,21,1211,111221,...

Generating function for lengths: xf(z)=P(z)/Q(z)  $x x^{*}$ with deg Q=72.

Smallest singularity:  $\delta(f) \approx 0.7671198507$ 

 $\rho = 1/\delta(f) \approx 1.30357727$ 

 $\rho \operatorname{Res}(f, \delta(f))$ 



remainder exponentially small

×××

# Algebraic Singularities $a_{n} = \frac{1}{2\pi i} \int_{\gamma} \frac{f(z)}{z^{n+1}} dz$

$$C_1 = 1 = \frac{1}{2\pi i} \oint \frac{1 - \sqrt{1 - 4z}}{2} \frac{dz}{z^2}$$

# Algebraic Singularities

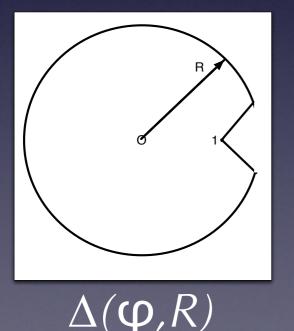
 $\mathsf{a}_\mathsf{n} = \frac{1}{2\pi\mathsf{i}} \int_\gamma \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$ 

$$C_1 = 1 = \frac{1}{2\pi i} \oint \frac{1 - \sqrt{1 - 4z}}{2} \frac{dz}{z^2}$$

Hankel:  $\frac{1}{\Gamma(a)} = \frac{1}{2\pi i} \int_{(0)}^{+\infty} (-t)^{-a} e^{-t} dt$ 

# Algebraic Singularities $a_{n} = \frac{1}{2\pi i} \int_{\gamma} \frac{f(z)}{z^{n+1}} dz$

$$C_1 = 1 = \frac{1}{2\pi i} \oint \frac{1 - \sqrt{1 - 4z}}{2} \frac{dz}{z^2}$$



**Thm.** [Flajolet-Odlyzko] If f is analytic in  $\Delta(\varphi, R)$  and  $f=O((1-z)^a)$  when  $z \rightarrow 1$ , then  $[z^n]f=O(n^{-a-1})$  when  $n \rightarrow \infty$ .

Method: expand, translate termwise, truncate.

Hankel:

 $\frac{1}{\Gamma(a)} = \frac{1}{2\pi i} \int_{(0)}^{+\infty} (-t)^{-a} e^{-t} dt$ 

Cayley trees

 $y - z \exp(y) = 0$ 

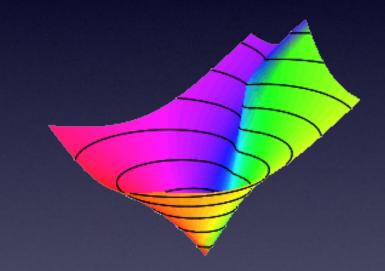


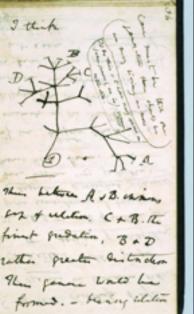
The Litra A & B. ching box of ulition C + B. The finit question, B + D withen prester bit notion 9 La gene Unto he formed. - the any chilin

#### Example

#### Cayley trees

 $y - z \exp(y) = 0$ 





Cayley trees  $y - z \exp(y) = 0$ 

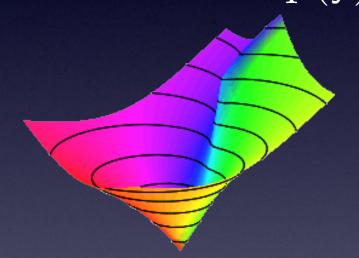
Obstruction to Implicit Function Theorem:  $1 - z \exp(y) = 0$ 



Cayley trees  $y - z \exp(y) = 0$ 

Obstruction to Implicit Function Theorem:  $1 - z \exp(y) = 0$ 

Consequences: Singularity at y=1, z=exp(-1);





Cayley trees  $y - z \exp(y) = 0$ 

Obstruction to Implicit Function Theorem:  $1 - z \exp(y) = 0$ Consequences: Singularity at y=1, z=exp(-1); Local behaviour by inverting  $z = y \exp(-y) = e^{-1} \left( 1 - \frac{1}{2}(y-1)^2 + O((y-1)^3) \right)$  $\Rightarrow y = 1 - \sqrt{2}\sqrt{1 - ez} + \frac{2}{3}(1 - ez) + O((1 - ez)^{3/2})$ 



Cayley trees  $y - z \exp(y) = 0$ 

Obstruction to Implicit Function Theorem:  $1 - z \exp(y) = 0$ Consequences: Singularity at y=1, z=exp(-1); Local behaviour by inverting  $z = y \exp(-y) = e^{-1} \left( 1 - \frac{1}{2}(y - 1)^2 + O((y - 1)^3) \right)$  $\Rightarrow y = 1 - \sqrt{2}\sqrt{1 - ez} + \frac{2}{3}(1 - ez) + O((1 - ez)^{3/2})$ Coefficients:  $\frac{I_n}{n!} = \frac{e^n}{\sqrt{2\pi n^{-3/2}}}(1 + O(1/n)).$ 

$$\mathsf{a_n} = \frac{1}{2\pi\mathsf{i}} \int_\gamma \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$$

$$\mathsf{a}_{\mathsf{n}} = \frac{1}{2\pi\mathsf{i}} \int_{\gamma} \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$$

Saddle-point equation:  $R_n \frac{f'}{f}(R_n) = n + 1$ 

$$\mathsf{a}_{\mathsf{n}} = \frac{1}{2\pi\mathsf{i}} \int_{\gamma} \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$$

Saddle-point equation:  $R_n \frac{f'}{f}(R_n) = n + 1$ 

Local behaviour:  $\approx \frac{f(R_n)}{R^{n+1}} \exp(c_n \frac{(z-R_n)^2}{2})$ 

$$\mathsf{a_n} = \frac{1}{2\pi\mathsf{i}} \int_\gamma \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$$

Saddle-point equation:  $R_n \frac{f'}{f}(R_n) = n + 1$ 

Local behaviour: 
$$\approx \frac{f(R_n)}{R_n^{n+1}} \exp(c_n \frac{(z-R_n)^2}{2})$$

Approximate by a Gaussian integral:

$$a_n \sim \frac{1}{2} \frac{f(R_n)}{R_n^{n+1} \sqrt{2\pi c_n}}$$

$$\mathsf{a_n} = \frac{1}{2\pi\mathsf{i}} \int_\gamma \frac{\mathsf{f}(\mathsf{z})}{\mathsf{z}^{\mathsf{n}+1}} \, \mathsf{d}\mathsf{z}$$

Saddle-point equation:  $R_n \frac{f'}{f}(R_n) = n + 1$ 

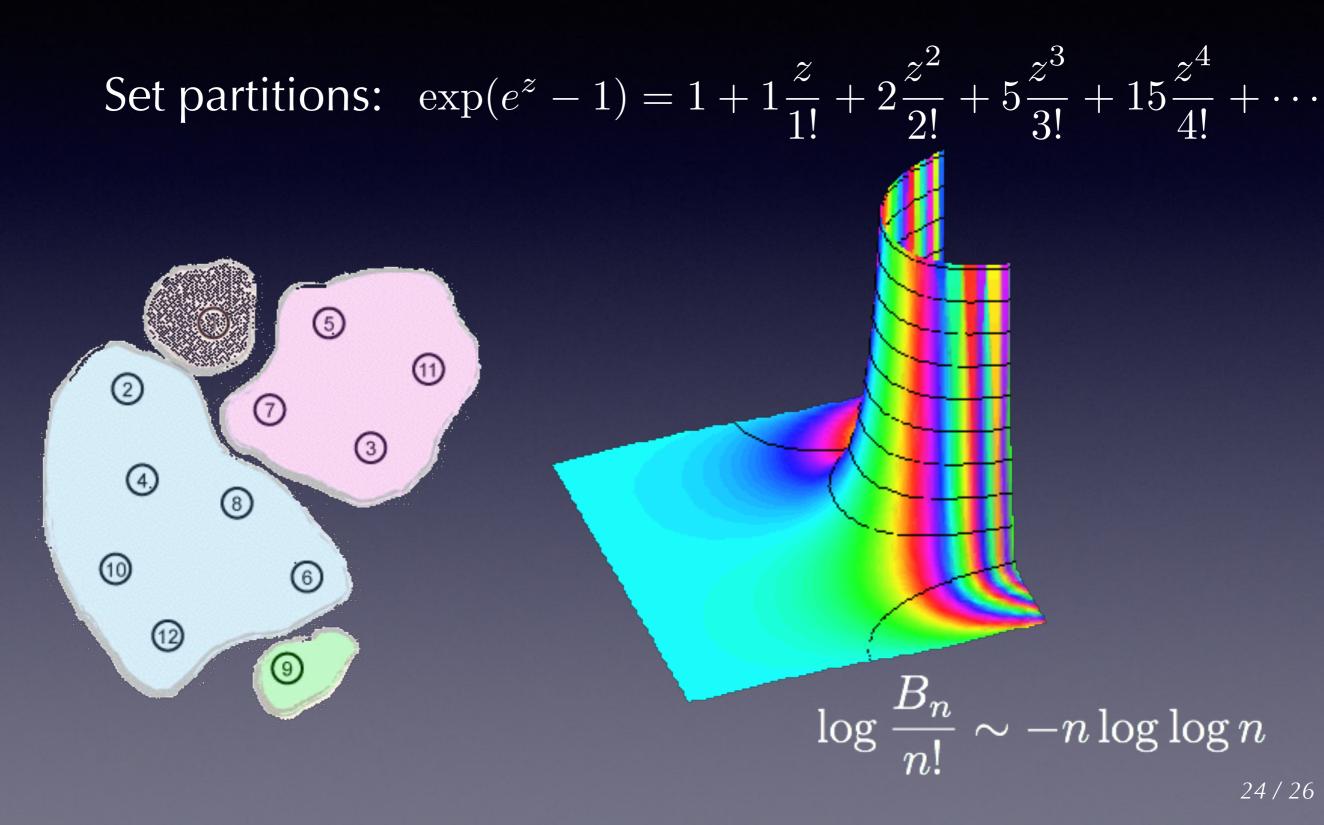
Local behaviour: 
$$\approx \frac{f(R_n)}{R_n^{n+1}} \exp(c_n \frac{(z-R_n)^2}{2})$$

Approximate by a Gaussian integral:

$$a_n \sim \frac{1}{2} \frac{f(R_n)}{R_n^{n+1} \sqrt{2\pi c_n}}$$

Exercise: Stirling's formula (f=exp).

## Other Example



# These 3 cases cover most applications

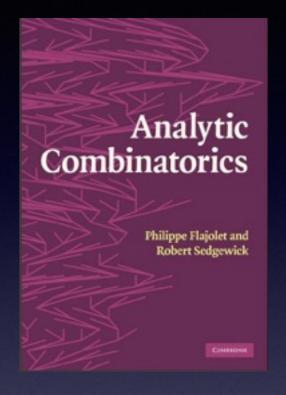
Demo?

More is possible:

Full asymptotic expansions; Limiting distributions; Fast enumeration; Random generation.

More is possible:

Full asymptotic expansions;Limiting distributions;Fast enumeration;Random generation.



More is possible:

Full asymptotic expansions; Limiting distributions; Fast enumeration; Random generation.



More is possible:

Full asymptotic expansions;Limiting distributions;Fast enumeration;Random generation.

Next step: automate the multivariate case



More is possible:

Full asymptotic expansions;Limiting distributions;Fast enumeration;Random generation.

Next step: automate the multivariate case



More is possible:

Full asymptotic expansions; Limiting distributions; Fast enumeration; Random generation.

> Questions? Office #317

Next step: automate the multivariate case

