## Analytic Functions and Small Complexity Classes

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Workshop on Mathematical Logic and its Applications Kyoto University, Kyoto, Japan

September 16, 2016

# TTE: Computable Real Numbers

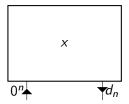
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A real number is called computable if it can be approximated up to any desired precision.

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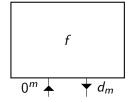


 $d_n$  rational approximations

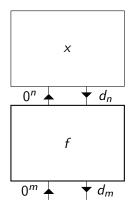
$$|d_n-x|\leq 2^{-n}.$$

### **Computable Real Function**

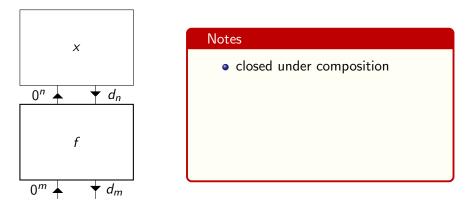
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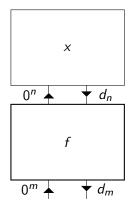


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A function  $f : [0,1] \to \mathbb{R}$  is called computable if the values f(x) can be approximated up to any desired precision.

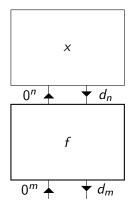


#### Notes

- closed under composition
- multidimensional functions: several input oracles and outputs.

### **Computable Real Function**

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#### Notes

- closed under composition
- multidimensional functions: several input oracles and outputs.
- Computable functions are continuous.

## Generalization

#### Representation

A representation for a set X is a partial surjective function  $\rho: \mathcal{B} \to X$ , that is, objects are encoded by string functions.

## Generalization

#### Representation

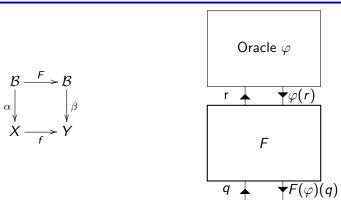
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## Generalization

#### Representation

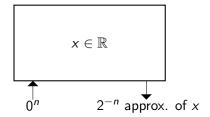
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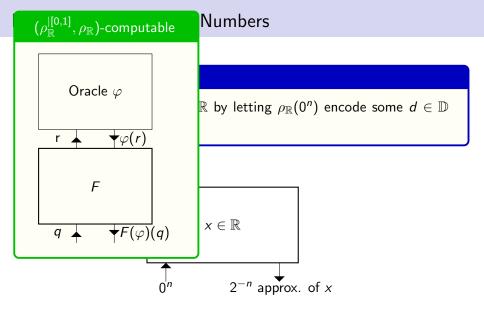


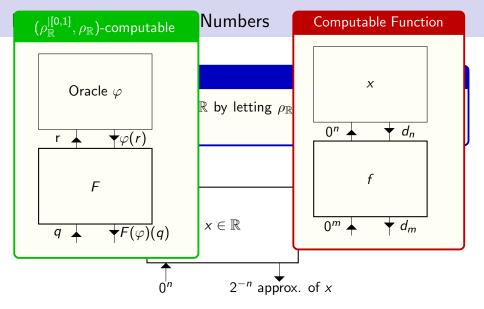
## Representation for Real Numbers

#### Example

Define a  $\rho_{\mathbb{R}}$ -name of  $x \in \mathbb{R}$  by letting  $\rho_{\mathbb{R}}(0^n)$  encode some  $d \in \mathbb{D}$  such that  $|d - x| \leq 2^{-n}$ .





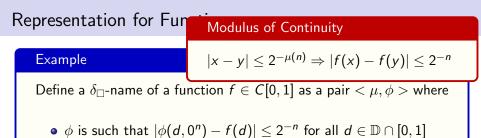


## Representation for Functions

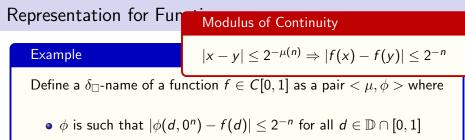
#### Example

Define a  $\delta_{\Box}$ -name of a function  $f \in C[0,1]$  as a pair  $<\mu,\phi>$  where

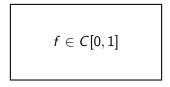
- $\phi$  is such that  $|\phi(d,0^n) f(d)| \le 2^{-n}$  for all  $d \in \mathbb{D} \cap [0,1]$
- $\mu$  encodes the modulus of continuity (in unary)

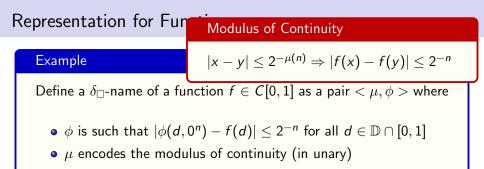


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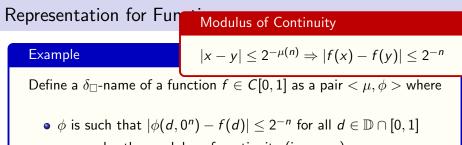


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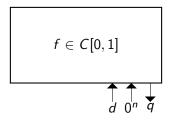




$$f \in C[0,1]$$



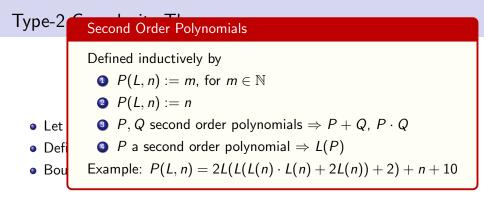
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• Let  $\Sigma^{**}$  be the set of length-monotone string-functions

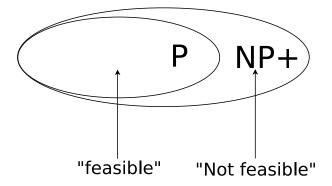
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- Define  $|arphi|:\mathbb{N} o\mathbb{N}$  by |arphi|(|u|)=|arphi(u)|

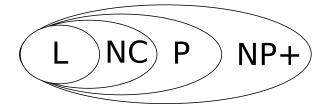
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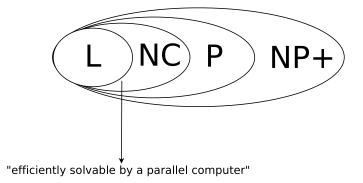


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- $\bullet$  Can define complexity classes  $\mathsf{FP}^2,\, \#\mathsf{P}^2$  and  $\mathsf{FPSPACE}^2$

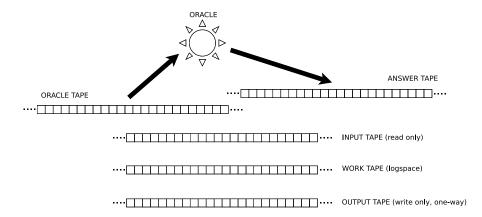
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- $\bullet$  Can define complexity classes  $\mathsf{FP}^2,\, \#\mathsf{P}^2$  and  $\mathsf{FPSPACE}^2$
- Can also define complexity classes P<sup>2</sup>, NP<sup>2</sup> and PSPACE<sup>2</sup> by considering functions  $\varphi : \Sigma^{**} \to (\Sigma^* \to \{0, 1\})$

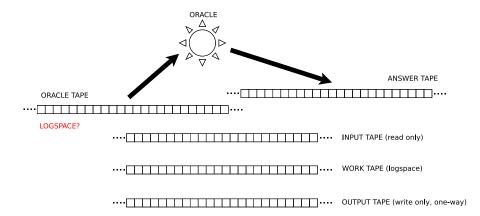


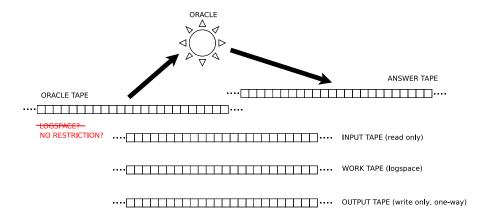


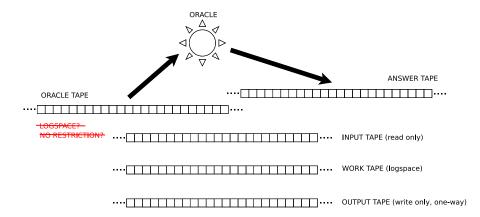




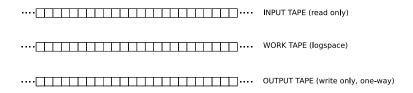




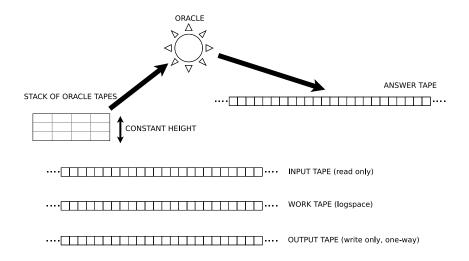




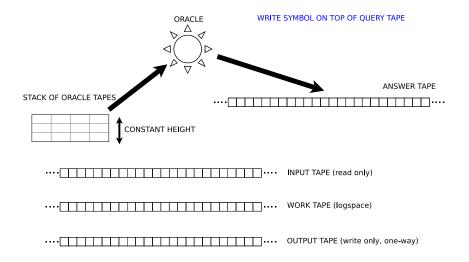
### The stack model (Kawamura and Ota)



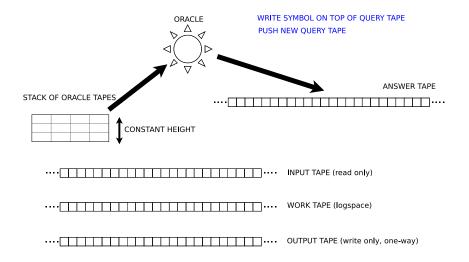
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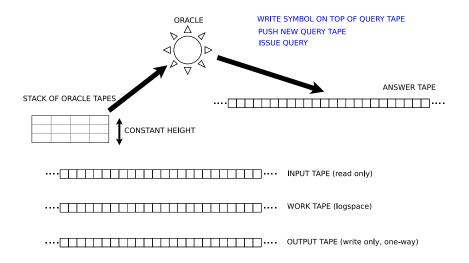
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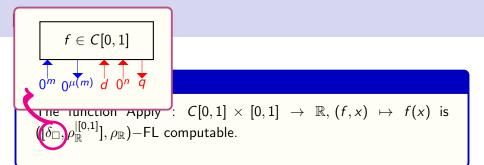
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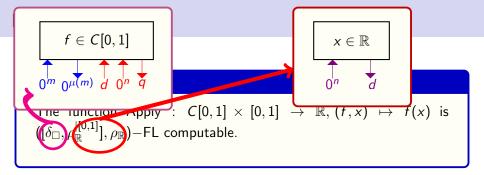


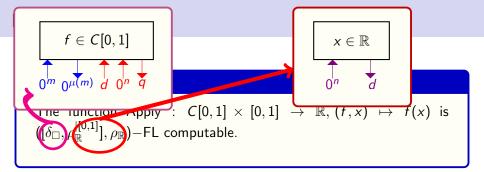
# Example

### **Function Application**

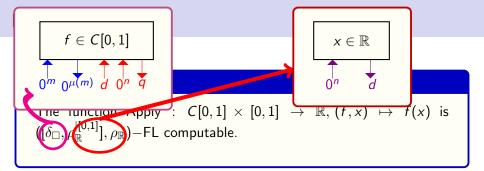
The function Apply :  $C[0,1] \times [0,1] \rightarrow \mathbb{R}, (f,x) \mapsto f(x)$  is  $([\delta_{\Box}, \rho_{\mathbb{R}}^{\mid [0,1]}], \rho_{\mathbb{R}})$ -FL computable.



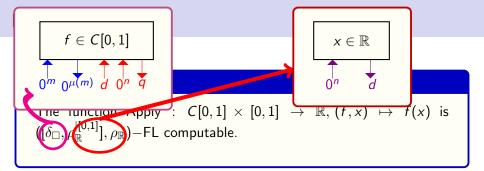




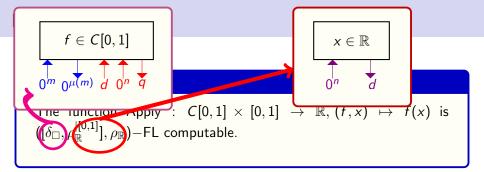
- Input:  $0^n$
- Stack:
- Oracle Output: arepsilon
- Work:  $\varepsilon$
- Output:  $\varepsilon$



Input:	0 <i><sup>n</sup></i>
Stack:	ε;ε;ε
Oracle Output:	ε
Work:	ε
Output:	ε

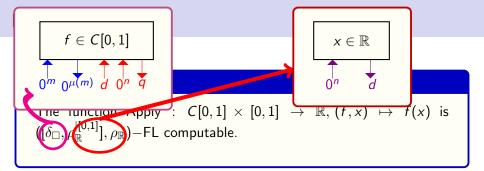


Input:	0 <i><sup>n</sup></i>
Stack:	$0^{n+1};\varepsilon;\varepsilon$
Oracle Output:	ε
Work:	ε
Output:	ε

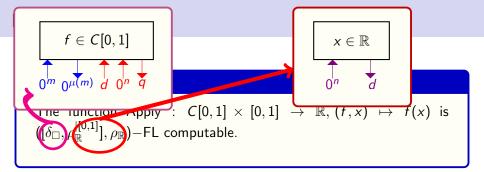


Input:
$$0^n$$
Stack: $\varepsilon; \varepsilon$ Oracle Output: $0^m$ Work: $\varepsilon$ Output: $\varepsilon$ 

$$|x - y| \le 2^{-m} \Rightarrow |f(x) - f(y)| \le 2^{-(n+1)}$$



Input:	0 <sup><i>n</i></sup>
Stack:	$0^m;\varepsilon$
Oracle Output:	0 <sup><i>m</i></sup>
Work:	ε
Output:	ε



Input:  $0^n$ Stack:  $\varepsilon$ 

Stack:

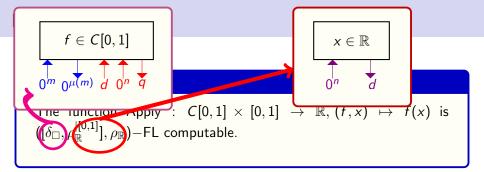
Oracle Output:

Work:  $\varepsilon$ 

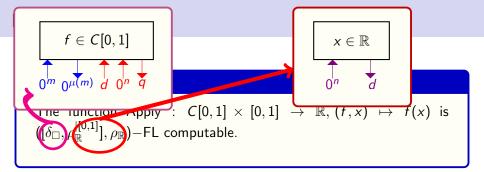
d

Output:  $\varepsilon$ 

$$|x-d| \le 2^{-m}$$



Input:	0 <i>n</i>
Stack:	$d, 0^{n+1}$
Oracle Output:	d
Work:	ε
Output:	ε

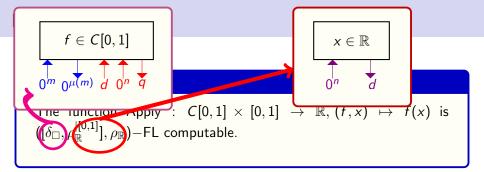


- Input:  $0^n$
- Stack:
- Oracle Output:
- Work:  $\varepsilon$

q

Output:  $\varepsilon$ 

$$|q-f(d)|\leq 2^{-(n+1)}$$



- Input:  $0^n$
- Stack:
- Oracle Output:

q

- Work:  $\varepsilon$
- Output: q

$$|q-f(x)|\leq 2^{-n}$$

# Example

### **Function Application**

The function Apply :  $C[0,1] \times [0,1] \rightarrow \mathbb{R}, (f,x) \mapsto f(x)$  is  $([\delta_{\Box}, \rho_{\mathbb{R}}^{|[0,1]}], \rho_{\mathbb{R}})$ -FL computable.

Similarly, Apply<sup>c</sup> :  $C[0,1] \times [0,1] \rightarrow [0,1] (f,x) \mapsto f^{c}(x)$  is  $([\delta_{\Box}, \rho_{\mathbb{R}}^{|[0,1]}], \rho_{\mathbb{R}})$ -FL computable for constant  $c \in \mathbb{N}$  using a stack of size 2c + 1.

#### Fact

For general polynomial time computable functions, many important operators have been shown to be computationally hard. For example

- Polynomial time computable functions may have non computable derivatives. (Ko 1983)
- Parametric maximization is NP-hard. (Ko/Friedman (1982))
- Integration is #P-hard. (Friedman (1984))

## Analytic Function

An analytic function is a function locally given by a complex power series.

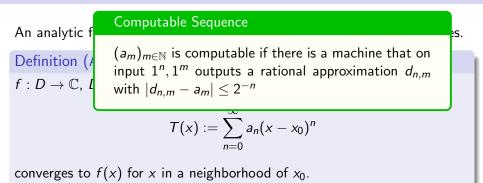
### Definition (Analytic Function)

 $f:D
ightarrow\mathbb{C}$ ,  $D\subseteq\mathbb{C}$  is analytic if for any  $x_0\in D$  the Taylor-series

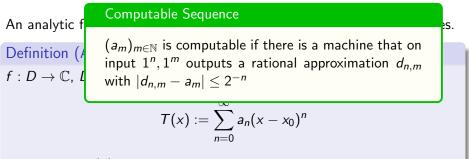
$$T(x) := \sum_{n=0}^{\infty} a_n (x - x_0)^n$$

converges to f(x) for x in a neighborhood of  $x_0$ .

# Analytic Function



# Analytic Function



converges to f(x) for x in a neighborhood of  $x_0$ .

Theorem (Pour-El, Richards, Ko, Friedman, Müller (1987/1989))

f is (polytime) computable iff  $(a_m)_{m\in\mathbb{N}}$  is.

From that polynomial time computability of the derivative and the anti-derivative of a function follows immediately.

## Representation for Analytic Functions

How to represent analytic functions?

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Theorem (Müller (1995))

The evaluation operator  $((a_m)_{m\in\mathbb{N}}, x) \to f(x)$  is not computable.

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#### Lemma

Let  $f : \overline{B}(0,1) \to \mathbb{R}$  be analytic and  $(a_n)_{n \in \mathbb{N}}$  its power series around 0. Then there exist  $k, A \in \mathbb{N}$  such that

- $\sqrt[6]{2}$  is a lower bound on the radius of convergence
- $|a_n| \le A \cdot 2^{-\frac{n}{k}}$

### Representation 1

A function  $\varphi \in \Sigma^{**}$  is a name for a power series  $(a_k)_{k \in \mathbb{N}}$  iff it is a concatenation of the following

An integer A encoded in binary

2 An integer k encoded in unary

3 A name for a sequence  $(a_k)_{k \in \mathbb{N}}$ 

Such that  $|a_n| \leq A \cdot 2^{-\frac{n}{k}}$  for all  $n \in \mathbb{N}$ .

### Representation 2

A (length-monotone) function  $\varphi : \Sigma^* \to \Sigma^*$  is a name for an analytic function  $f : \overline{B}(0,1) \to \mathbb{R}$  iff it is a concatenation of the following

- An integer A encoded in binary,
- An integer k encoded in unary,
- **③** A name for the function f

Such that f extends analytically to  $B(0, \sqrt[k]{2})$  and  $|f(z)| \le A$  for all  $z \in B(0, \sqrt[k]{2})$ 

### Theorem (Kawamura, Rösnick, Müller, Ziegler (2013))

With the previous two representations the following operations can be performed in polynomial time

- evaluation
- 2 addition and multiplication
- Ifferentiation and anti-differentiation
- parametric maximization

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With the previous two representations the following operations can be performed in polynomial time

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- Ifferentiation and anti-differentiation
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Further, when identifying an analytic function with its power series, the operators that compute one representation from the other are polynomial-time computable.

# Complexity of Ordinary Differential Equations

Theorem (Kawamura, 2010) Consider the IVP

$$y'(t) = f(t, y(t))$$
;  $y(0) = 0$ .

There exists functions  $f:[0,1]\times [-1,1]\to \mathbb{R}$  and  $y:[0,1]\to [-1,1]$  as above such that

- **1** *f* is Lipschitz-continuous and polynomial time computable
- y is PSPACE-hard.

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f is Lipschitz-continuous and polynomial time computable
y is PSPACE-hard.

For analytic right-hand side y will again be analytic and polynomial time computable.

# Analytic Functions and Small Complexity Classes

Consider functions complex analytic on the closed unit disc.

### Representation 1 Integers A, k and the series sequence $(a_k)_{k \in \mathbb{N}}$ . $|a_n| \le A \cdot 2^{-\frac{n}{k}}$ for all $n \in \mathbb{N}$ .

### Representation 2

Integers A, k, and name for function f. f extends analytically to  $B(0, \sqrt[k]{2})$  and  $|f(z)| \le A$  for all  $z \in B(0, \sqrt[k]{2})$ 

Those two representations are logspace equivalent.

# Representation 1 $\Rightarrow$ Representation 2

#### Task

Given A, k s.t. 
$$|a_n| \leq A \cdot 2^{-\frac{n}{k}}$$
 for all  $n \in \mathbb{N}$ .  
Find A', k' s.t. for all  $z \in B(0, \sqrt[k']{2}) |f(z)| \leq A'$ 

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#### Solution

Let k' = 2k and A' = 4kA

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### Solution

Let 
$$k' = 2k$$
 and  $A' = 4kA$ 

### Proof

For 
$$z \in B(0, \sqrt[k']{2})$$
 :  $f(z) = \sum_{n=0}^{\infty} a_n z^n \le A \sum_{n=0}^{\infty} 2^{-\frac{n}{k}} \cdot 2^{\frac{n}{2k}} \le 4Ak$ 

## Representation 1 $\Rightarrow$ Representation 2

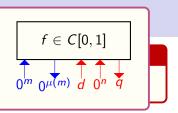
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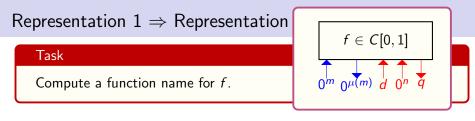
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# Representation 1 $\Rightarrow$ Representation

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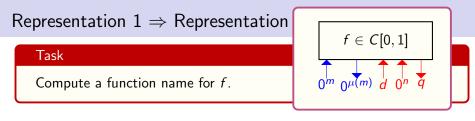
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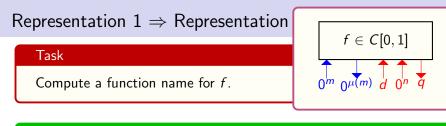
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 $m\mapsto m+\log_2(A)+2\log_2(k)+5$  is a modulus of continuity for the function.



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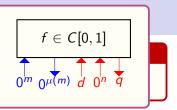


#### Solution

We need to evaluate  $N \approx n \cdot k + \log(A)$  terms of the sum.  $\sum_{i=0}^{poly(n)} a_i x^i$  is logspace computable.

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Compute a function name for f.



### Solution

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## Proof

The following is logspace computable

- **()** Addition and Multiplication of polynomially many *n*-bit integers
- **2**  $x^m$  with precision polynomial in *n* for polynomial length *m*
- Operation of constantly many logspace computable functions

### Task

Given A, k s.t. for all 
$$z \in B(0, \sqrt[k'/2]) |f(z)| \le A$$
  
Compute A', k' such that  $|a_m| \le A \cdot 2^{-\frac{m}{k}}$  for all  $m \in \mathbb{N}$ .

### Solution

We can just set A' = A and k' = k.

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## Solution

We can just set 
$$A' = A$$
 and  $k' = k$ .

## Proof

By Cauchy's integral formula 
$$|a_m| = \frac{f^{(m)}(0)}{m!} \le A \cdot 2^{-\frac{n}{k}}$$
 for all  $n \in \mathbb{N}$ .

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- Differentiate this polynomial and evaluate at 0
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### Proof

- Computing factorials and binomial coefficients of polynomial size is logspace computable.
- To get the coefficient  $a_m$  the function has to be evaluated at 2m + 1 equidistant points with polynomial precision (see e.g.Müller).

### Logspace computable operations

Similarly, the following operations on analytic functions are computable in logartihmic-space

Addition, Subtraction, Multiplication of two analytic functions

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- Addition, Subtraction, Multiplication of two analytic functions
- Computing the *d*-fold derivative

#### Logspace computable operations

Similarly, the following operations on analytic functions are computable in logartihmic-space

- Addition, Subtraction, Multiplication of two analytic functions
- Computing the *d*-fold derivative
- S Computing the *d*-fold anti-derivative

# Multidimensional Analytic Functions

### Multidimensional Power Series

$$\sum_{i \in \mathbb{N}} \sum_{j \in \mathbb{N}} a_{i,j} x_1^i x_2^j = \sum_{i \in \mathbb{N}} b_i x_1^i$$
  
with  $b_i := \sum_{j \in \mathbb{N}} a_{i,j} x_2^j$ 

Computing  $b_i \rightarrow$  evaluating an analytic function.

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Computing  $b_i \rightarrow$  evaluating an analytic function.

$$egin{aligned} |a_{i,j}| &\leq A \cdot 2^{-rac{i+j}{k}} ext{ for all } n \in \mathbb{N}. \ |b_i| &\leq \sum_{j \in \mathbb{N}} |a_{i,j}| \left| x_2 
ight|^j &\leq A 2^{-rac{i}{k}} \sum_{j \in \mathbb{N}} 2^{-rac{j}{k}} = A 2^{-rac{j}{k}} rac{\sqrt[k]{2}}{\sqrt[k]{2}-1} &\leq \mathbf{(2Ak)} 2^{-rac{i}{k}} \end{aligned}$$

# Multidimensional analytic functions

#### Representation

A function  $\varphi \in \Sigma^{**}$  is a name for a *d* dimensional power series  $(a_{n_1,\dots,n_d})_{n_1,\dots,n_d \in \mathbb{N}}$  iff it is a concatenation of the following

- An integer A encoded in binary
- 2 An integer k encoded in unary

**3** A name for a sequence 
$$(a_k)_{k \in \mathbb{N}}$$

Such that  $|a_{n_1,\ldots,n_d}| \leq A \cdot 2^{-\frac{n_1+\cdots+n_d}{k}}$  for all  $n \in \mathbb{N}$ .

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#### Note

Complexity of evaluation (and most other operations) is **exponential** in the dimension!

# Open Problem: P-completeness

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#### Theorem

For the set *M* of bijective functions in *C*[0,1], define the  $\delta_{\Box INV}$ representation by adding a modulus of continuity for the inverse function to the  $\delta_{\Box}$  representation. The function  $Inv : M \to C[0,1]$ ,  $Inv(f) \mapsto f^{-1}$  is  $(\delta_{\Box INV}, \delta_{\Box})$ -FP-complete. Kawamura and Ota also define the notions of reductions and completeness. For example they give the following uniform version of a theorem by Ko

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Which operations on analytic functions are P-hard?

- Initial Value Problem?
- Maximization?

## Open Problem: P-completeness

### Initial Value Problem

$$\dot{y}(t) = f(y(t))$$
;  $y(0) = 0$ .

## Open Problem: P-completeness

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#### Power series

$$f^{[0]}(y) = y$$
  
$$f^{[k+1]}(y) = \frac{1}{k+1}f(y)\frac{d}{dy}f^{[k]}(y)$$

Then

$$a_k = \frac{1}{k!} y^{(k)}(0) = f^{[k]}(0)$$

This can be used to get a recurrence relation that makes it possible to compute the coefficients in polynomial time. Can they also be computed without such a recurrence?

- Presented Kawamura and Ota's model for logspace computability in analysis.
- In this model many operations on analytic functions are logspace computable, when considering representations that have previously been considered for polynomial time computability.
- Open Problems: Parametrized Maximization, Ordinary Differential Equations
- Connection to parallelization in exact real arithmetic
- Implementations