

Parameterized Uniform
Complexity in Numerics:
from Smooth to Analytic,
from NP-hard to Polytime

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#### **Real Function Complexity**



(GMP/

Function  $f:[0,1] \rightarrow \mathbb{R}$  computable in time t(n)

if some TM can, on input of  $n \in \mathbb{N}$  and of

 $(a_m)\subseteq \mathbb{Z}$  with  $|x-a_m/2^{m+1}|<2^{-m}$   $=:\rho_{dy}\equiv_{p}\rho_{sd}$ 

in time t(n) output  $b \in \mathbb{Z}$  with  $|f(x)-b/2^{n+1}| < 2^{-n}$ .

**Examples:** a) +,  $\times$ , exp polytime on [0;1]!

- b)  $f(x) \equiv \sum_{n \in L} 4^{-n}$  iff  $L \subseteq \{0,1\}^*$  polytime-decidable
- c) sign(eHeanistideolytitree-repretable

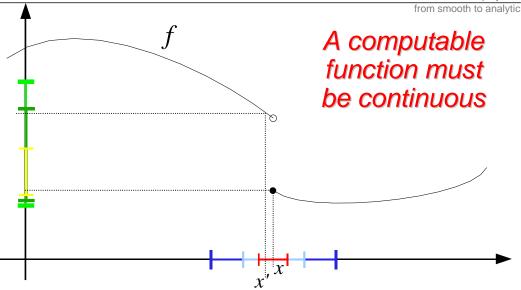
**Observation** i) If f computable  $\Rightarrow$  continuous.

- ii) If f computable in time t(n), then
- t(n+2) is a modulus of uniform continuity of f.

 $\mathbb{D}_n := \{ k/2^n : k \in \mathbb{Z} \}, \mathbb{D} = \bigcup_n \mathbb{D}_n \text{ dyadic rationals }$ 

#### Computable Real Functions





 $x \in \mathbb{R}$  computable  $\Leftrightarrow |x - a_n/2^{n+1}| \le 2^{-n}$  for recursive  $(a_n) \subseteq \mathbb{Z}$ 

### **3 Effects in Real Complexity**



with

- Consider multivalued 'functions'
- additional <u>discrete</u> data ('enrichment').

**Example c1):** exp not computable on entire  $\mathbb{R}$ , **c2)** Evaluation  $(f,x) \rightarrow f(x)$  is not computable in time depending only on output precision n.

**Example b):** Given real symmetric  $d \times d$  matrix A, find <u>an</u> eigenvector: incomputable; but computable when knowing Card  $\sigma(A)$  [Z+B'04]

parameterized real complexity.

**Example a):** Tests for in-/equality are undecidable

canonicalse4/f/x declaration/interface

#### Nonuniform Complexity of Operators W UNIVERSITATION OF COMPLEX OF THE PROPERTY OF THE PROPERTY



 $f:[0;1] \rightarrow [0;1]$  polytime computable ( $\Rightarrow$  continuous)

• Max:  $f \to \text{Max}(f)$ :  $x \to \text{max}\{f(t): t \le x\}$ 

Max(f) computable in exponential time;

polytime-computable iff  $\mathcal{P} = \mathcal{N}\mathcal{P}$ 

- $\int: f \to \int f: x \to \int_0^x f(t) dt$ uniform  $\rfloor f$  computable in exponential time; "#P-complete" Negativistic !!
- even when restricting to  $f \in \mathbb{C}^{\infty}$ but for analytic f polytime 2
- dsolve: C[0;1]×[-1;1]  $\ni f \to z$ :  $\dot{z}(t)=f(t,z), z(0)=0$ .
- in general no computable solution z(t)
- for  $f \in \mathbb{C}^1$  " $\mathcal{PSPACE}$ -complete" Positivistic!!
- for  $f \in \mathbb{C}^k$  " $\mathcal{CH}$ -hard" Phase transition  $\mathbb{C}^{\omega} \to \mathbb{C}^{\omega}$

#### Representing Power Series



incomputable [ZhWe'01]

• radius of convergence  $(R)=1/\limsup_{i}|c_{i}|^{1/j}$ 

- to 0 < r < R exist  $C \in \mathbb{N}$ :  $|c_i| \le C/r^i$  (Cauchy-Hadamard)
- $\mathbb{N} \ni \overline{(R)} \ge 1/\log(r) = \Theta(1/(r-1))$  binary unary
- tail bound  $|\sum_{j\geq N} c_j z^j| \leq C \cdot (|z|/r)^N/(1-|z|/r)$

#### Complexity uniform in $|z| \le 1$ : (i.e. R > 1)

Convergence degrades es as  $r\rightarrow 1$ ; quantitatively? parametrized running time

**Theorem 1:** Represent series  $\sum_i c_i z^j$  with R > 1as [a  $(\rho_{dv})^{\omega}$ -name of]  $(c_i)$  and  $K, C \in \mathbb{N}$  as above.

The following are uniformly computable in time polyn. in  $n+K+\log(C)$ : i) eval, ii) sum, iii) product, iv) derivative, v) anti-derivative, vi) Max

# 'Max is $\mathcal{NP}$ -hard'



 $\mathcal{NP} \ni L = \{ \underline{x} \in \{0,1\}^n \mid \exists \underline{y} \in \{0,1\}^{p(n)} : \langle \underline{x},\underline{y} \rangle \in V^{\text{byth}} \}$  $\uparrow^1$  C $^{\infty}$ 'pulse' function  $\langle x,y\rangle \in V$  $\Phi(t) = \exp(-t^2/1-t^2), |t| < 1$  $\downarrow_{1/2}$  polytime computable  $\langle \underline{x},\underline{y}\rangle \notin V$  $d^n/dx^n \ \varphi(C\cdot x-z)/C^n \le ?$ +1/4 too, uniformly in C,z

To every  $L \in \mathcal{NP}$  there exists a polytime computable  $C^{\infty}$  function  $f_I:[0,1] \rightarrow \mathbb{R}$  s.t.:  $[0,1] \ni y \longrightarrow \max f_L|_{[0,v]}$  polytime iff  $L \in \mathcal{P}$ 

#### **Parameterized Real Complexity**



 Classical complexity theory: worst-case over all inputs of length *n* as parameter

- parametrized complexity (FPT etc): 2 param.s (n,k)
- Complexity of a single real: n = output precision
- of a real function f: n = output precisionin worst-case over all arguments  $x \in [0,1]$  compact!
- or parameterized e.g. in  $k=\lceil |x| \rceil$  or  $k=\lceil \log |x| \rceil$
- TTE: encode x as *infinite* binary sequence, length= $\infty$
- $\underline{x}=(x_j)$  real sequence: access time polynom. in n+jMust 'skip' over  $2^n$  entries to access  $f(2^{-n})$
- Real operator/functional  $\Lambda$ : encode input  $f \in \text{Lip}[0;1]$
- as values on dense sequence  $0,1,\frac{1}{2},\frac{1}{4},\frac{3}{4},\frac{1}{8},\frac{3}{8},\frac{5}{8},...=:D$
- and Lipschitz constant l∈N as discrete data & advice

### 2<sup>nd</sup> Order Representations



From NP-hard to polytime

Meta-**Def**: representation of G is a surject.  $\gamma:\subseteq 2^{\omega} \to G$ 

 $\gamma$ -name  $z:1*\rightarrow\{0,1\}$  communic. on tape

access time= input length  $\Gamma$ -name Z:{0,1}\*→{0,1}\* communic. via **oracle** 

Kawamura&Cook'10 generalize to surject.  $\Gamma: \subseteq \omega^{\omega} \to G$ ,  $dom(\Gamma) \subseteq \mathcal{LM} := \{ Z: \{0,1\}^* \to \{0,1\}^*, \ |Z(\underline{u})| \le |Z(\underline{v})| \ \forall |\underline{u}| \le |\underline{v}| \}$   $\Rightarrow$  extend from sequential to (realistic) random access

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#### **Real Analytic Functions on [0,1]**



**Definition:**  $C^{\omega}[-1,1] := \{ f:[-1;1] \to \mathbb{R} \text{ restriction of complex differentiable } g:U \to \mathbb{C}, [0,1] \subset U \subset \mathbb{C} \text{ open } \}$ 

• real sequence  $f(\mathbb{D})$ 

•  $L \subseteq \mathbb{N}$  unary:  $R_L \subseteq U$ 

**Theorem 2:** These are mutually 2<sup>nd</sup> ord

•  $G \in \mathbb{N}$  binary  $\forall z \in R_L$ :  $|g'(z)| \leq G$  polytime equivalent

**Equivalent:**  $f \in \mathbb{C}^{*}[-1,1]$  and  $\exists k \in \mathbb{N} \ \forall j: ||f^{(j)}|| \leq 2^{k} \cdot k^{j} \cdot j!$ 

• real sequence  $f(\mathbb{D})$  and  $k \in \mathbb{N}$  unary

**Equiv.:** f finitely many local power series on [-1;1]  $\sum_{j} c_{j,m} (z-x_m)^j$ , m=1...M unary  $C_m K_m \in \mathbb{N}$ :  $|c_{j,m}| \le C_m/2^{j/K_m}$ 

**Theorem 3:** On  $C^{\omega}[0,1]$ , i) eval ii) sum ... vi) max are computable within parameterized polyn. time

## 2<sup>nd</sup> Order Polyn.s & Time



'Long' names Z require much time to even read – cmp. evaluation of 'steep' real functions...

 $\gamma$ -name  $z:1*\rightarrow\{0,1\}$  communic. on tape

access time= input length Γ-name Z:{0,1}\*→{0,1}\* communic. via **oracle** 

Kawamura&Cook'10 generalize to surject.  $\Gamma: \subseteq \omega^{\omega} \to G$ ,  $dom(\Gamma) \subseteq \mathcal{LM} := \{ Z: \{0,1\}^* \to \{0,1\}^*, |Z(\underline{u})| \le |Z(\underline{v})| \ \forall |\underline{u}| \le |\underline{v}| \}$   $\Rightarrow$  extend from sequential to (realistic) random access

 $K:=|Z|:\mathbb{N}\to\mathbb{N}, |\underline{u}|\to |Z(\underline{u})|$  well-defined

term over  $\mathbb{N}_{i}+\mathbf{x},n,K(i)$ 

- Consider 2nd order representation of C[0;1] s.t. steep functions have long names
- Permit 2nd order polynomial running times P(n,K)
- ⇒ closed under (both kinds of) composition, generalizes (parameterized) 1<sup>st</sup> order polynom. time

## **Overview**



from smooth to analytic

Complexity of real functions

- Non-uniform complexity of real operators:
- $\mathcal{NP}$ -hard on  $C^{\infty}$ , polytime on analytic (= $C^{\omega}$ )
- Enrichment rendering power series computable
- in parameterized polynomial time.
- 2<sup>nd</sup> order representation rendering computable
- <u>real analytic</u> functions in 2<sup>nd</sup> order polytime.
- Gevrey's function hierarchy between  $C^{\omega}$  and  $C^{\infty}$
- and 2<sup>nd</sup> order representations with complexity.

#### **Gevrey's Function Hierarchy**



**Definition** (Maurice Gevrey 1918, studying PDEs)  $g \in \mathcal{G}^{\ell}_{k}[-1;1] : \Leftrightarrow \forall j : ||g^{(j)}|| \leq 2^{k} \cdot k (j^{j \cdot \ell})$ 

2<sup>nd</sup> order repr.

**Lead state of (D) and unary in apping N** $\ni n \rightarrow k+n^{\ell}$ 

 $\Rightarrow \exists B \ \forall n \ \exists p \in \mathbb{D}[X]: \deg(p) < B \cdot n^{\ell} \ \|g - p\| \le 2^{-n} \Rightarrow g \in G^{2\ell-1}[-1;1]$ 

• sequence  $p_n \in \mathbb{D}[X]$  with  $\deg(p_n) < B \cdot n^{\ell} ||g - p_n|| \le 2^{-n}$ 

**Equivalent:**  $f \in \mathbb{C}^{\infty}[-1;1]$  and  $\exists k \in \mathbb{N} \ \forall j: ||f^{(j)}|| \leq 2^k \cdot k (j!)$ 

• real sequence  $f(\mathbb{D})$  and  $k \in \mathbb{N}$  unary

**Example:** The following g is not analytic but in  $G^3[-1;1]$ 

$$g(x) := \exp\left(\frac{x^2}{x^2-1}\right) \text{ for } |x| \le 1,$$

g(x) := 0for  $|x| \geq 1$ 

## **Conclusion and Perspectives**



- Max and  $\int$  are nonuniformly  $\mathcal{NP}$ -hard on  $\mathbb{C}^{\infty}[-1;1]$
- but nonunif. polytime on  $C^{\omega}[-1;1]$ , i.e. analytic f.

Today: uniform computability and parameterized complexity of operators on Gevrey's hierarchy  $G^{\ell}$ climbing from  $C^{\omega}$  to  $C^{\infty}$  with <u>optimal</u> runtime  $n^{\text{poly}(\ell)}$ 

#### **Theorem 4 (our main result):**

- a) Both 2<sup>nd</sup> order representations of  $\bigcup_{k,\ell} \mathcal{G}^{\ell}_{k}$ are 2<sup>nd</sup> order polynomial-time equivalent and
- b) render i) eval, ii) sum, ... iv) d/dx, v)  $\int$ , vi) max computable within time polynomial in  $(k+n)^{\text{poly}(\ell)}$
- c) Given  $f(\mathbb{D})$ , max on  $G^{\ell}$  requires time  $\Omega(n^{\ell})$ .

#### **Uniform Complexity** on Gevrey's Hierarchy



from smooth to analytic **Definition** (Maurice Gevrey 1918, studying PDEs)  $g \in \mathcal{G}^{\ell}_{k}[-1;1] : \Leftrightarrow \forall j : ||g^{(j)}|| \leq 2^{k} \cdot k^{j} \cdot j^{j \cdot \ell}$ 2<sup>nd</sup> order repr.

- real sequence  $f(\mathbb{D})$  and unary mapping  $\mathbb{N} \ni n \longrightarrow k+n^{\ell}$  $\Rightarrow \exists B \ \forall n \ \exists p \in \mathbb{D}[X]: \deg(p) < B \cdot n^{\ell} \ ||g - p|| \le 2^{-n}$
- sequence  $p_n \in \mathbb{D}[X]$  with  $\deg(p_n) < B \cdot n^{\ell} ||g p_n|| \le 2^{-n}$

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- Actually implement and evaluate these algorithms (irram)
- Quantitatively refine the upper complexity bounds
- Multivariate case?

