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alpha, beta:  
  alpha:  
  beta:  
  length:  
  ...
```

# Mathematik

# *Real Complexity Theory: a numerical view on "P vs. NP"*



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# 日本学術振興会

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# Computable Real Numbers

**Theorem:** For  $r \in \mathbb{R}$ ,  
Call  $r \in \mathbb{R}$  **computable** if  
the following are equivalent:

There is an algorithm  
which, given  $n \in \mathbb{N}$ , prints  
 $b_n \in \{0,1\}$  where  $r = \sum_n b_n 2^{-n}$

a)  $r$  has a computable binary expansion

b) There is an algorithm printing, on input  
 $m \in \mathbb{N}$ , some  $a \in \mathbb{Z}$  with  $|r - a/2^{m+1}| \leq 2^{-m}$

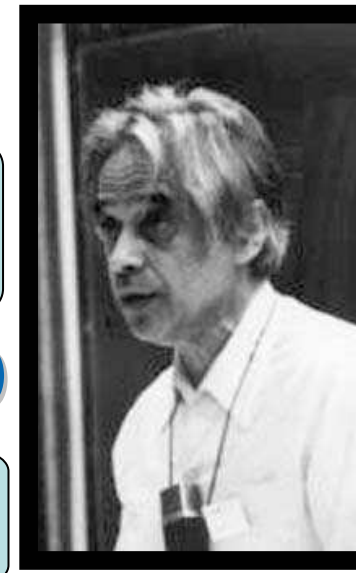
c) There is an algorithm printing two  
sequences  $(q_n) \subseteq \mathbb{Q}$  and  $(\varepsilon_n)$  with  $|r - q_n| \leq \varepsilon_n \rightarrow 0$

$\Leftrightarrow r \in [q_n \pm \varepsilon_n]$

numerators+  
denominators

b)  $\Leftrightarrow$  c) holds *uniformly*,  
 $\Leftrightarrow$  a) does not [Turing'37]

interval  
arithmetic



Ernst Specker (1949): (c)  $\Leftrightarrow$  *Halting problem* plus (d)

d) There is an algorithm printing  $(q_n) \subseteq \mathbb{Q}$  with  $q_n \rightarrow r$ .

$H := \{ \langle B, \underline{x} \rangle : \text{algorithm } B \text{ terminates on input } \underline{x} \} \subseteq \mathbb{N}$



# Uniformly Computable Real Functions



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

# Real Function Complexity



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Introduction to Real Complexity Theory

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  $|x - a_m / 2^{m+1}| \leq 2^{-m}$

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

IRRAM

**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)  $\text{sign}(e^x)$  **not** **polytime** **computable**

$$|x-y| \leq 2^{-t(n)} \Rightarrow |f(x)-f(y)| \leq 2^{-n}$$

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

ii) If  $f$  computable in **time**  $t(n)$ , then

$t(n)$  is a modulus of uniform continuity of  $f$ .



# On the Complexity of Operators

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

- Max:  $f \rightarrow \text{Max}(f): x \rightarrow \max\{ f(t): t \leq x \}$

$\text{Max}(f)$  computable in exponential time;  
polytime-computable iff  $\mathcal{P} = \mathcal{NP}$

even when  
restricting  
to  $f \in C^\infty$

- $\int: f \rightarrow \int f: (x \rightarrow \int_0^x f(t) dt)$

$\int f$  computable in exponential time;  
"# $\mathcal{P}$ -complete"

- dsolve:  $C[0;1] \times [-1;1] \ni f \rightarrow z: \dot{z}(t) = f(t, z), z(0) = 0.$

- in general no computable solution  $z(t)$
- for  $f \in C^1$   $\mathcal{PSPACE}$ -"complete" [Kawamura'10,
- for  $f \in C^k$   $\mathcal{CH}$ -"hard" Kawamura et al]

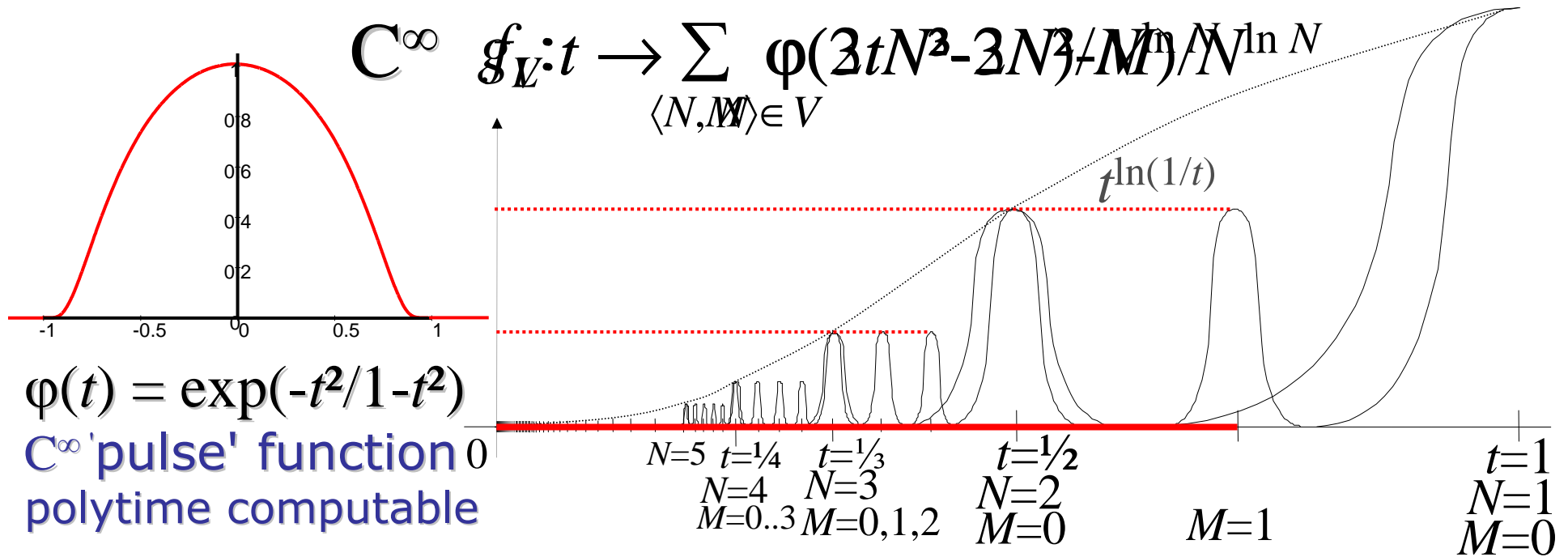
[Friedman&Ko'82]

# 'Max is NP-hard'

obvious in the discrete case

Introduction to Real Complexity Theory

$$\mathcal{NP} \ni L = \{ M \in \mathbb{N} \mid \exists M < N: \langle N, M \rangle \in f_V \text{ polytime } \mathcal{P} \}$$



To every  $L \in \mathcal{NP}$  there exists a polytime computable  $C^\infty$  function  $g_L: [0, 1] \rightarrow \mathbb{R}$  s.t.:

$[0, 1] \ni t \rightarrow \max g_L|_{[0, t]}$  again polytime iff  $L \in \mathcal{P}$



# On the Complexity of Operators

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

- Max:  $f \rightarrow \text{Max}(f): x \rightarrow \max\{ f(t): t \leq x \}$  [Friedman & Ko'82]

Max( $f$ ) computable in exponential time;  
polytime-computable iff  $\mathcal{P} = \mathcal{NP}$

- $\int: f \rightarrow \int f: (x \rightarrow \int_0^x f(t) dt)$
- $\int f$  computable in exponential time;  
# $\mathcal{P}$ - "complete" [Friedman & Ko'82]

**non-uniform**

even when restricting to  $f \in C^\infty$   
**but for analytic  $f$  polytime**

- dsolve:  $C[0;1] \times [-1;1] \ni f \rightarrow z: \dot{z}(t) = f(t, z), z(0) = 0.$ 
  - in general no computable solution  $z(t)$
  - for  $f \in C^1$   $\mathcal{PSPACE}$ - "complete" [Kawamura'10, Kawamura et al]
  - for  $f \in C^k$   $\mathcal{CH}$ - "hard"

[N. Müller], [Bournez et al]



# Three Effects in Real Complexity

that numerical scientists might be interested in / should be aware of

cmp. "feasible real-RAM"

- a) natural emergence of multivaluedness (aka non-extensionality)  $\rightarrow$   $\varepsilon$ -semantics of " $<$ "
- b) Uniform computation may require discrete advice or otherwise 'enriched' representations (TTE) — which yield canonical C++ declarations
- c) Parameterized uniform upper complexity bounds

**Example** (Brattka&Z, *Computable Spectral Thm*)

Finding an eigenvector (basis) to a given real

**Example:** +, exp computable in time polynomial

in  $n$  on  $[0;1]$ ; on  $[0;2^k]$ : + in time polynomial in

$n+k$ , exp in time polynomial in  $n+2^k$ .

independent of  $x$   
on compact dom



# Obstacles to a Uniform Complexity Theory of Operators



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Introduction to Real Complexity Theory

Evaluation  $\text{Eval}:(f,x)\rightarrow f(x)$

a) requires  $\geq \mu(n)$  steps,  $\mu:\mathbb{N}\rightarrow\mathbb{N}$  mod. of continuity to  $f$ .

"Parameter"  $\mu(f)$  is not  $\mathbb{N}$ -valued but  $\mathbb{N}^{\mathbb{N}}$ -valued!

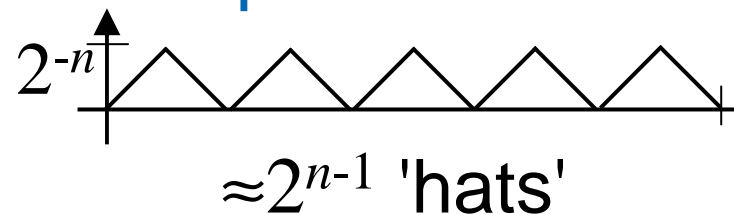
b) Even restricted to the compact domain **sequent. access**

$\mathcal{L}_1 := \{ f:[0;1]\rightarrow[0;1] \text{ 1-Lipschitz} \}$  (Arzela-Ascoli)

there exists no representation  $\delta:\subseteq\{0,1\}^{\omega}\rightarrow\mathcal{L}_1$

rendering Eval computable in *subexponential* time.

$\geq 2^{2^{n-1}}$  functions pairwise differing when evaluating up to error  $2^{-n}$  but only  $2^{t(n)}$  different initial segments of  $\delta$ -names that can be read within  $t(n)$  steps. q.e.d.



# Conclusion, Work in Progress, Open Questions



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Introduction to Real Complexity Theory

- Computing maxima, integrals, and ODEs is hard; and smoothness presumptions kicks in late.
- Discrete advice/enrichment and multivaluedness
  - uniform complexity theory of operators
  - and of higher type objects  
(Calculus of Variation, Optim.Control, Shape Opt.)
  - complexity of Euclidean subsets
  - complexity of analytic ODEs
  - complexity of PDEs
  - characterize more complexity classes numerically
- Why do numerical algorithms work so well in practice? → formalization / smoothened analysis
- Transfer from theory to practice: **iRRAM**