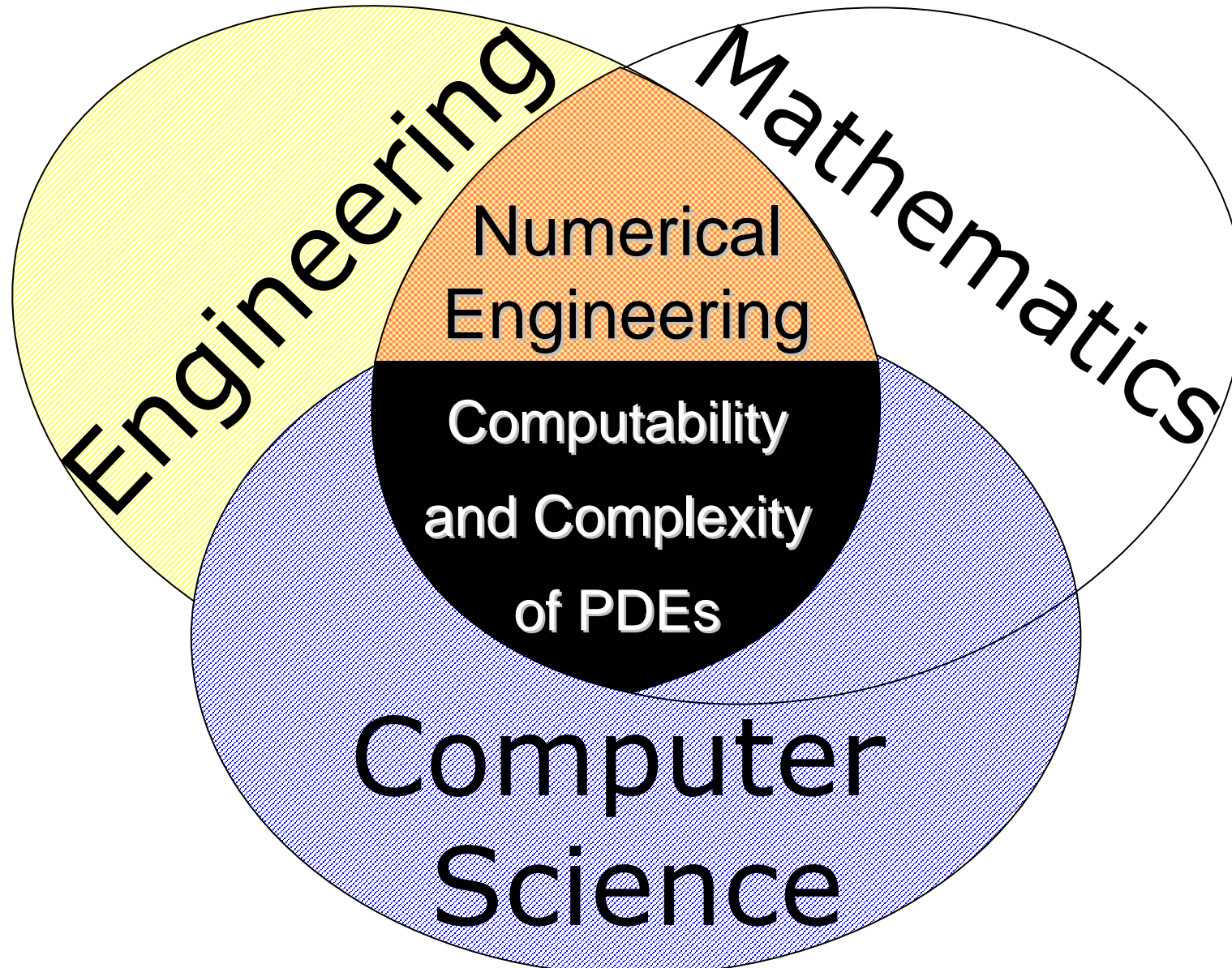


Martin ZIEGLER, Mar.13, IRTG1529, WASEDA

Computability and Complexity Theory of PDEs

Algorithmic Foundations of Numerics



Overview

1. Theory of Computing over countable, discrete sets
2. Theory of Computing over separable metric spaces
3. Un-/computability of PDEs
4. Complexity Theory of PDEs
5. Encodings of function spaces
6. Summary and Perspectives

Theory of Computing over countable, discrete sets

Computability
& Complexity
of PDEs

Input: finite bit string / encoded integer, graph...; **Output:** 0/1

Runtime asymptotic growth w.r.t. binary input length $n \rightarrow \infty$

Given an integer N , encoded in binary: is it a prime number?

Given a $n \times n$ snapshot of *Gobang*, does Black have a winning strategy?

Given an integer linear program, is it solvable?

Given an integer linear program, how many solutions does it have?

Given (the source code of) an algorithm, will it eventually halt when executed?

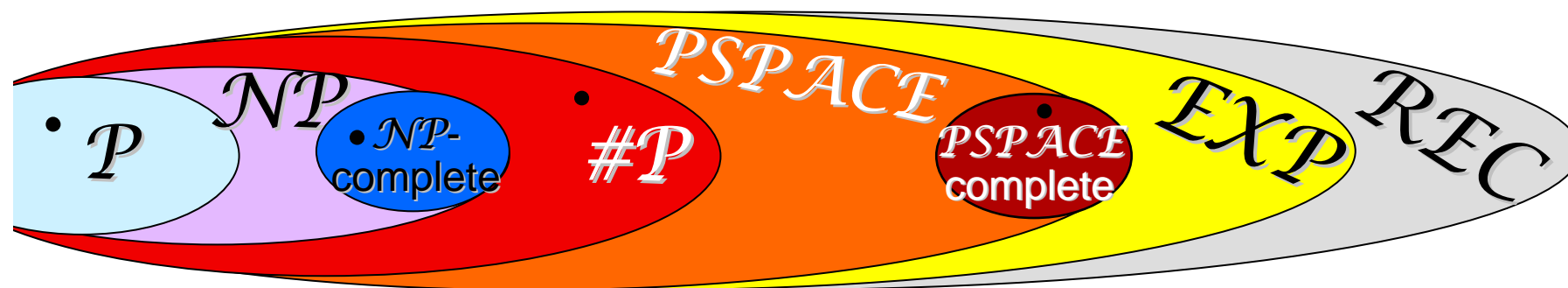
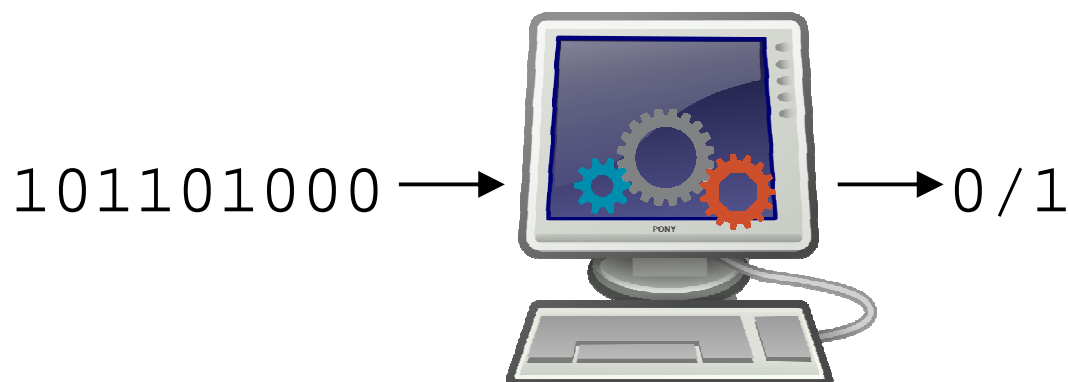


Theory of Computing over countable, discrete sets

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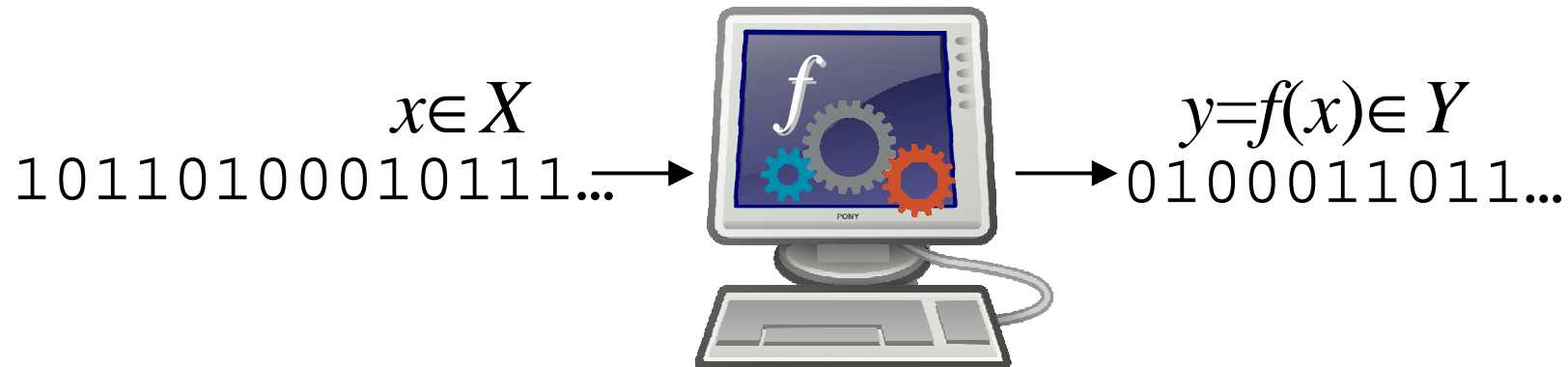


Theory of Computing over separable metric spaces X, Y

Computability
& Complexity
of PDEs

Input: finite bit string / encoded integer, graph...; Output: 0/1

Runtime asymptotic growth w.r.t. binary input length $n \rightarrow \infty$



Definition: a) **Input:** infinite bit string

encoding some $x \in X$ by a sequence of approximations

b) **Output:** infinite bit string

encoding $y = f(x) \in Y$ by a sequence of approximations

c) **Runtime** asymptotically w.r.t. binary output length $n \rightarrow \infty$

independent of x :
for compact X

Theory of Computing over separable metric spaces

⇔ Halting problem

- Fact:**
- (i)–(iv) computably equivalent; strictly stronger than v)
 - Algorithm can convert (ii) ↔ (iii) ↔ (iv); but not → (i)
 - Conversion runtime (ii) ↔ (iii) is polynomial, (iv) → (ii) not
 - $+$, \times , \exp , \ln , ... computable in polynom. time w.r.t. (ii), (iii)

-
- i) sequence of binary coefficients $(b_n) \subseteq \{0,1\}$ s.t. $r = \sum_n b_n 2^{-n}$
 - ii) sequence of *signed* bin. coefficients $(c_n) \subseteq \{-1,0,1\}$ s.t. $r = \sum_n c_n 2^{-n}$
 - iii) sequence of dyadic approximations $(a_n) \subseteq \mathbb{Z}$ s.t. $|r - a_n/2^n| \leq 2^{-n}$
 - iv) unbounded sequences $(a_n), (b_n), (c_n) \subseteq \mathbb{Z}$ s.t. $|r - a_n/b_n| \leq 1/c_n$
 - v) sequence $(a_n) \subseteq \mathbb{Z}$ s.t. $a_n/2^n \rightarrow r$ as $n \rightarrow \infty$.

Definition: a) Input: infinite bit string

encoding some $x \in X$ by a sequence of approximations

b) Output: infinite bit string

encoding $y = f(x) \in Y$ by a sequence of approximations

c) Runtime asymptotically w.r.t. binary output length $n \rightarrow \infty$

Theory of Encodings of separable metric spaces

Computability
& Complexity
of PDEs

- Fact:**
- (i)–(iv) computably equivalent;
 - Algorithm can convert (ii) \leftrightarrow (iii) \leftrightarrow (iv);
 - Conversion runtime (ii) \leftrightarrow (iii) is polynomial,
 - $+$, \times , \exp , \ln , ... computable in polynom. time w.r.t. (ii), (iii)

Research programme: Take a space X with operations f, g, \dots

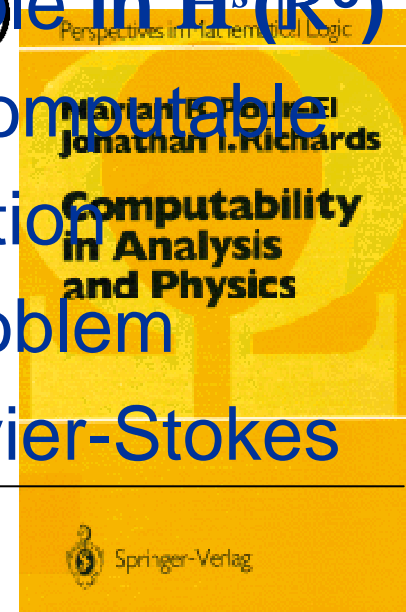
- Devise 'reasonable' encodings of X over infinite binary strings
- that render given operations f, g, \dots (polyn.time) computable.
- Compare&classify encodings w.r.t. computable equivalence, w.r.t. computable conversion, polynomial-time convertability

- Examples:**
- a) \mathbb{R} with $+$, \times , \exp , \ln , \lim , $<$ w.r.t. computability
 - b) Finite/countable Cartesian products, quotients, unions, ...
 - c) Compact Euclidean sets
 - d) space $C(X, Y)$ of cont. func.s
 - e) Analytic functions
 - f) Gevrey's Hierarchy [Kawamura, **Z**, ...]

Computability of PDEs

- Weierstrass function \rightarrow [Myhill'71] computable $h \in C^1(\mathbb{R})$ with uncomputable derivative $h'(1)$ and $h \equiv 0$ on $[0, 1/2]$
- [Pour-El&Richards'81] 3D wave equation with initial condition $f(\underline{x}) := h(|\underline{x}|)$, $g(\underline{x}) := 0 \rightarrow$ **uncomputable** $u(1, \underline{0})$

- [Weihrauch&Zhong'02] Wave eq. computable in $H^s(\mathbb{R}^3)$
- [Weihrauch&Zhong'05] solution to KdV is computable
- [Weihrauch&Zhong'06] Schrödinger's equation
- [Weihrauch&Zhong'07] abstract Cauchy problem
- [Sun&Zhong&Z.'15] L^2 -computability of Navier-Stokes



Church-Turing Hypothesis (Kleene):

Anything 'computed' by a physical device

can also be approximated by a Turing machine $\partial^2/\partial t^2 u(t, \underline{x}) = \Delta u(t, \underline{x})$, $\partial/\partial t u(0, \underline{x}) = g(\underline{x})$

Non-Uniform Complexity of Operators on $C[0;1]$

Fix polyn.time computable (\Rightarrow continuous) $f:[0;1] \rightarrow [0;1]$

- Max: $f \rightarrow \text{Max}(f): x \rightarrow \max\{ f(t): t \leq x \}$
 $\text{Max}(f)$ computable in exponent. time;
 polyn.time-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;
 polynom-time computable iff $\mathcal{P}=\#\mathcal{P}$

polytime if f is analytic

- odesolve: $C^1([0;1] \times [-1;1]) \ni f \rightarrow z: \dot{z}(t)=f(t,z), z(0)=0.$
 \mathcal{PSPACE} - "complete"

[Kawamura, Ota, Rösnick, Z.'14]

- Solution to Poisson's Equation is classical and $\#\mathcal{P}$ - "complete"

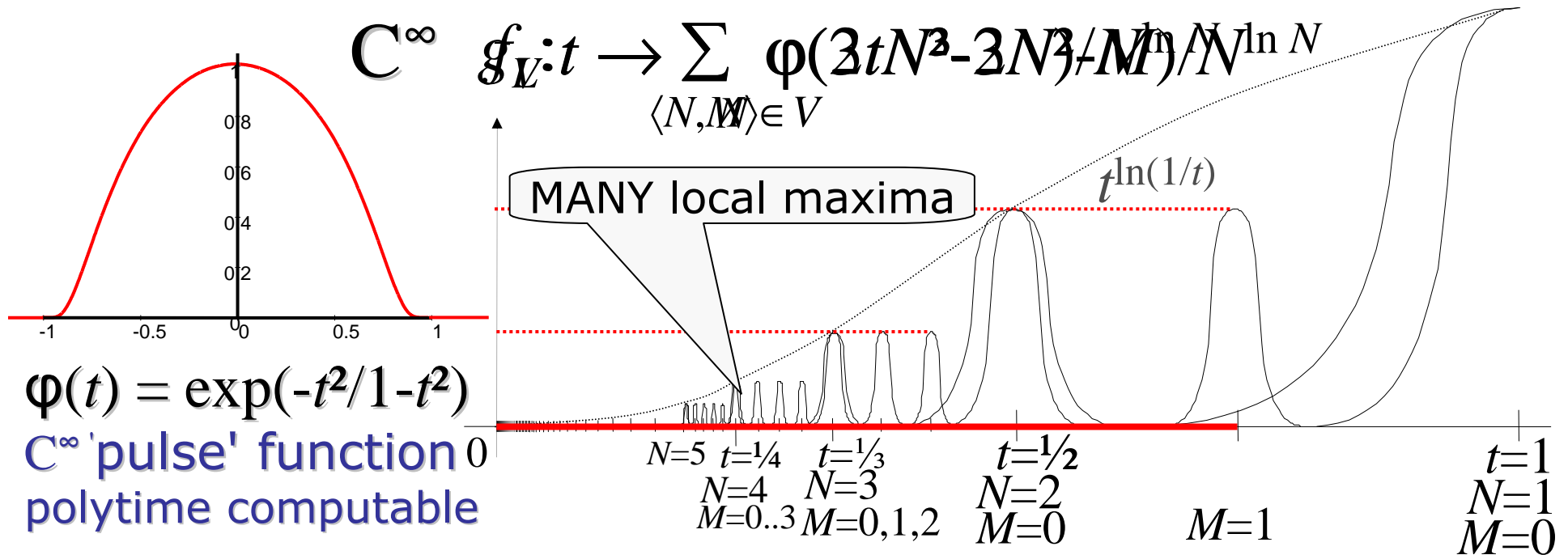
$$\begin{aligned} \Delta u &= f \text{ on } B_2(\mathbf{0}, 1) \\ u &= 0 \text{ on } \partial B_2(\mathbf{0}, 1) \end{aligned}$$

[Kawamura, Steinberg, Z.'13]

$$\mathcal{P} \subseteq \mathcal{NP} \subseteq \#\mathcal{P} \subseteq \mathcal{PSPACE} \subseteq \mathcal{EXP}$$

'Max is NP-hard'

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



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

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

Uniform Complexity of Operators

Encoding Function Spaces

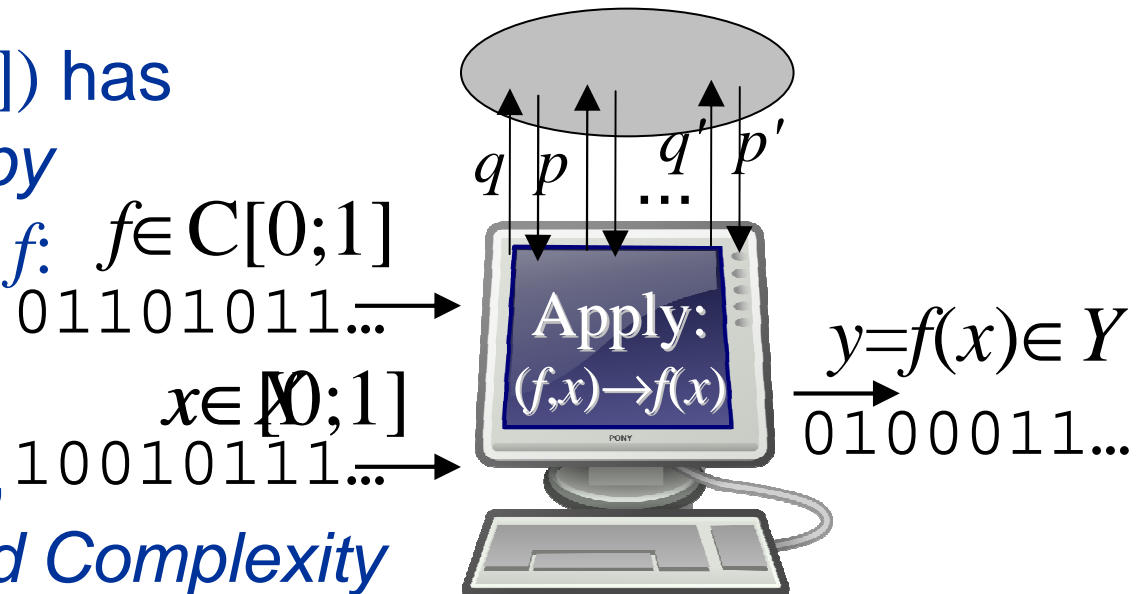
Computability
& Complexity
of PDEs

There is no encoding of the (compact) set $\text{Lip}_1([0;1],[0;1])$ rendering application $(f,x) \rightarrow f(x)$ polynomial-time computable:

Because $\text{Lip}_1([0;1],[0;1])$ has too large a *metric entropy*

for sequential access to $f: f \in C[0;1]$
encoding over strings

Give oracle access to f , *cmp. Information-Based Complexity*



Research programme: Take a space X with operations f,g,\dots

- Devise 'reasonable' encodings of X over infinite binary strings
- that render given operations f,g,\dots (polyn.time) computable
- Compare&classify encodings w.r.t. computable equivalence, w.r.t convertibility, w.r.t. polynomial-time convertibility

Uniform Complexity of Operators

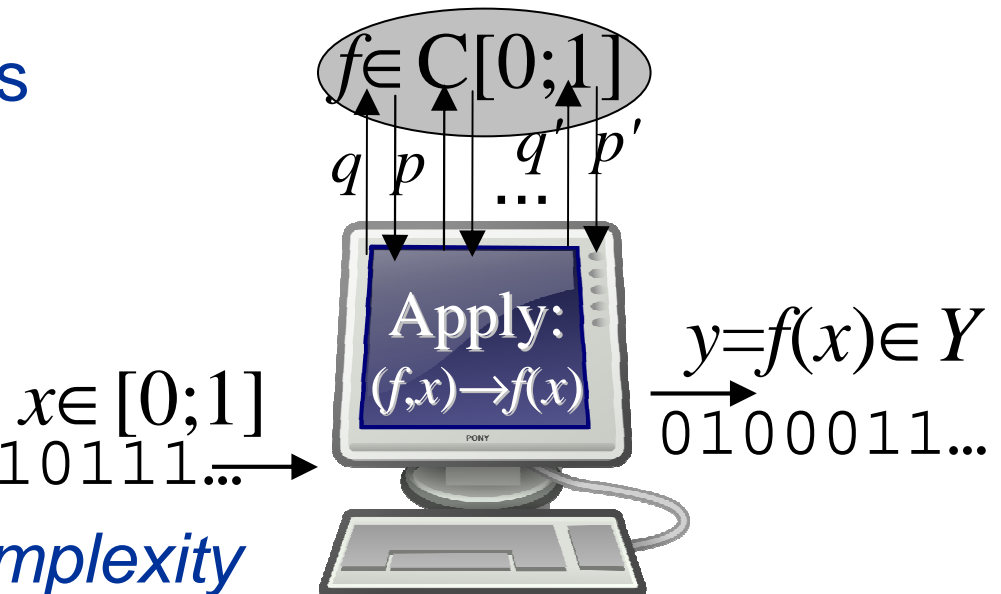
Encoding Function Spaces

Computability
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- There is no encoding of the (compact) set $\text{Lip}_1([0;1],[0;1])$ rendering application $(f,x) \rightarrow f(x)$ polynomial-time computable:

- Because $\text{Lip}_1([0;1],[0;1])$ has too large a *metric entropy* for sequential access to f : encoding over strings

- Give oracle access to f , $10010111\dots$
cmp. *Information-Based Complexity*



- [Kawamura&Cook'10]: A 2nd-order representation is an encoding over graded Baire space of binary string *functions*
- $C[0;1]$ is not (even σ -)compact, no runtime bounds in n only:
- [Kawamura&Cook'10]: 2nd-order polynomial time on $C[0;1]$: bounded by a polynomial in n and a modulus of continuity of f

Summary and Perspectives

- Rigorous algorithmic foundation of numerical calculations:
- Systematic study of encodings of separable metric spaces
- comparison/classification w.r.t. (polyn.-time) computability
- Purportedly "easy" computational problems over the reals actually correspond to known algorithmically hard ones: Millennium Prize P/\mathcal{NP} or even undecidable Halting problem.
- Previous results on computability of solutions to PDEs
- to refine from the perspective of computational complexity
- uniformly, i.e. with initial data "given" by encoding as oracle
- require non-classical function spaces for well-posedness
- Canonical encoding of L^p and Sobolev spaces?
- Counterpart to *modulus of continuity* as runtime parameter?