
ON TYPE-2 COMPLEXITY CLASSES

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CONSTABLE'S QUESTIONS

Constable, in 1973, asked:

Q1 What is the **type-2** analogue of **PF**?

Q2 What is the computational complexity theory of the **type-2 effectively continuous functionals**?

(Symes' 1971 thesis.)

Terminology

PF $\stackrel{\text{def}}{=}$ the polynomial-time computable functions (of type $\mathbb{N} \rightarrow \mathbb{N}$)

type-2 $\stackrel{\text{def}}{=}$ functions of type $(\mathbb{N} \rightarrow \mathbb{N})^k \times \mathbb{N}^\ell \rightarrow \mathbb{N}$

effectively continuous functionals

$\stackrel{\text{def}}{=}$... not this talk ...

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Q1: WHAT IS HIGHER-TYPE PTIME?

Why **this** as a first step?

- ▶ Force of habit.
- ▶ We need landmarks to ground our work.
- ▶ Most examples are too simple or too complex.
- ▶ So we need to proceed by analogy.
- ▶ In ordinary complexity theory, **P** and **PF** are useful and flexible reference classes.

But how to proceed?

TWO STANDARD WAYS TO DEFINE A SUBRECURSIVE CLASS

Synthetic/Implicit/P.L.-Based/...

Given a restrictive P.L. or function algebra F .
Then the class = the F -computable functions.

Example

Cobham's characterization of PF .

Analytic/Explicit/Machine-Based/...

Given

- (a) a general machine or P.L. + a cost model
- (b) a way of measuring the size of an input, and
- (c) a family of bounding functions,

Then the class = the things computable through
that model under those resource
bounds.

Example

PF = the functions computable on a TM (with
the usual cost model) in time polynomial
in the length of the input.

THE TYPE-2 BASIC FEASIBLE FUNCTIONALS

BFF_2

= the **type-2 PV^ω computable functionals**, where
 $PV^\omega \approx$ the simply-typed λ calculus + \mathcal{R} + PF
(Cook-Urquhart)

= the **type-2 BTLP computable functionals**, where
BTLP = Bounded Typed Loop Programs
(Cook-Kapron)

⋮

= the **basic polynomial-time functionals**, where
these are the functionals computed by OTMs that
run in time (2nd-order) polynomial in
the (type-0 and -1) lengths of their inputs.
(Kapron-Cook)

There are other notions of type-2 poly-time (e.g., BC),

Q2: WHAT IS THE COMPLEXITY THEORY OF THE EFF. CONTINUOUS FUNCTIONALS?

We don't have an answer to that question yet.

But if we change the question to:

Q2': What is the complexity theory of the computable
functions of type $(\mathbb{N} \rightarrow \mathbb{N}) \times \mathbb{N} \rightarrow \mathbb{N}$?

then we have a start at an answer.

Why is Q2' easier than Q2?

BUT WHAT FLAVOR OF COMPLEXITY THEORY?

CONCRETE

Specific machine/cost models.

Hartmanis and Stearns, 1965

AXIOMATIC/ABSTRACT

Machine independent

Blum, 1967

We'll choose the concrete version of complexity theory
... matters are strange enough already.

First, we take a quick look at type-1 (ordinary,
old-fashion, ...) complexity theory.

CONVENTIONS

- ▶ $\mathbb{N} \equiv \{0, 1\}^*$.
- ▶ M_0, M_1, \dots — a standard indexing of TMs.
- ▶ $\varphi_i(x) \stackrel{\text{def}}{=} \text{the result of running } M_i \text{ on input } x$.
This may be undefined.
- ▶ $\Phi_i(x) \stackrel{\text{def}}{=} \text{the number of steps taken by } M_i \text{ on } x$.
This may be ∞ . (N.B. $\infty \neq \perp$.)
- ▶ A TM **must** read its entire input string.
 \therefore Distinct inputs yield distinct computations.
- ▶ Suppose $f, g: \mathbb{N} \rightarrow \mathbb{N}$
 - $f \leq g$ means $(\forall x) f(x) \leq g(x)$.
 - $f \leq^* g$ means $(\forall^\infty x) f(x) \leq g(x)$.
 - Similarly, with $f = g, f =^* g, f < g, f <^* g$, etc.

TYPE-1 COMPLEXITY CLASSES

DEFINITION. For each computable $t: \mathbb{N} \rightarrow \mathbb{N}$,

$$\mathcal{C}(t) =_{\text{def}} \{ \varphi_i \mid i \in \mathbb{N} \ \& \ \varphi_i \text{ is total} \ \& \ \Phi_i \leq^* t \}.$$

We say that $\mathcal{C}(t)$ is the complexity class named by t .

A SAMPLE ELEMENTARY RESULT (Rabin, 1960).

For each computable t ,

there is some 0–1 valued $f: \mathbb{N} \rightarrow \mathbb{N}$

such that $f \notin \mathcal{C}(t)$.

Why are complexity classes interesting?

Because they describe boundaries.

OUR GOAL: TYPE-2 COMPLEXITY CLASSES

Recall the type-1 definition

$$\mathcal{C}(t) \stackrel{\text{def}}{=} \{ \varphi_i \mid i \in \mathbb{N} \ \& \ \varphi_i \text{ is total} \ \& \ \Phi_i \leq^* t \}.$$

QUESTIONS:

- ▶ What replaces φ and Φ ?
What is the machine/cost model?
- ▶ What replaces t ?
What is a type-2 complexity bound?
- ▶ What replaces \leq^* ?
What is the right notion of “finitely many exceptions”?

OUR TYPE-2 MACHINE MODEL

- ▶ We use Oracle Turing Machines (OTMs) with function $(\mathbb{N} \rightarrow \mathbb{N})$ oracles.
- ▶ query \cong call to an oracle: $f(x) = ?$
- ▶ Each OTM step has unit cost.
- ▶ Each OTM **must** read all of each oracle answer.
This convention gives us the answer-length cost model.

Why OTMs?

CONVENTIONS, II

- ▶ \mathcal{F} = the finite functions over \mathbb{N}
- ▶ σ ranges over \mathcal{F}
- ▶ $\bar{\sigma}$ = the mod. of σ that is 0 every place σ is undefined.

- ▶ $\hat{M}_0, \hat{M}_1, \dots$ — a standard indexing of OTMs.

- ▶ $\hat{\varphi}_i(f, x) \stackrel{\text{def}}{=} \text{the result of running } \hat{M}_i \text{ on oracle } f \text{ and input } x. \text{ This may be undefined.}$

- ▶ $\hat{\Phi}_i(f, x) \stackrel{\text{def}}{=} \text{the } \# \text{ of steps taken by } \hat{M}_i \text{ on } f \text{ and } x. \text{ This may be } \infty.$

CONVENTIONS, II — TOO

- ▶ $\text{Queries}_i(f, x, n) \stackrel{\text{def}}{=} \text{the set of queries } \widehat{M}_i \text{ makes on } f \text{ and } x \text{ within its first } n \text{ steps.}$
- ▶ $\text{Use}_i(f, x, n) \stackrel{\text{def}}{=} \{ (y, f(y)) : y \in \text{Queries}_i(f, x, n) \}$
- ▶ $\text{Queries}_i(f, x) \stackrel{\text{def}}{=} \bigcup_n \text{Queries}_i(f, x, n)$
- ▶ $\text{Use}_i(f, x) \stackrel{\text{def}}{=} \bigcup_n \text{Use}_i(f, x, n)$
- ▶ $\widehat{\Phi}_i(\sigma, x) \stackrel{\text{def}}{=} \begin{cases} \widehat{\Phi}_i(\bar{\sigma}, x), & \text{if } \text{Queries}_i(\bar{\sigma}, x) \subseteq \{ y \mid \sigma(y) \downarrow \}; \\ n, & \text{otherwise, where } n = \# \text{ of steps} \\ & \text{taken up to the issuance of the} \\ & \text{first query, } y, \text{ such that } \sigma(y) \uparrow. \end{cases}$

TYPE-2 COMPLEXITY BOUNDS

What we don't do and why

Suppose $F: (\mathbb{N} \rightarrow \mathbb{N}) \times \mathbb{N} \rightarrow \mathbb{N}$ is computable.

Then we might say that

the complexity of \hat{M}_i is everywhere bounded by F
iff
for all f and all x , $\hat{\Phi}_i(f, x) \leq F(f, x)$.

(Symes 71, Kapron 91, Seth 94)

What is wrong with this?

THEOREM.

Suppose that $\hat{\Phi}_i \leq T$ and $\hat{\varphi}_b = T$. Then, for all f and x
 $\text{Queries}_i(f, x) \subseteq \text{Queries}_b(f, x)$.

\therefore In order for $\hat{\Phi}_i \leq F$ to hold, $\hat{\varphi}$ -program b on input (f, x)
has to make **all possible** queries that \hat{M}_i could make on
input (f, x) . \therefore **The clerk is in control.**

TYPE-2 COMPLEXITY BOUNDS

Our approach

- ▶ We make the bounding function a passive observer of the computation it is bounding.
- ▶ The bounding function determines a bounding value based on what it has seen so far.

DEFINITION. Suppose $\beta: \mathcal{F} \times \mathbb{N} \rightarrow \mathbb{N}$ is computable.

(a) We say that β determines a **weak type-2 time bound** iff it satisfies the following:

Nontriviality: $\beta(\sigma, x) \geq |x| + 1$.

Convergence: $\lim_{\tau \rightarrow f} \beta(\tau, x) \downarrow < \infty$.

Boundedness: $\sup_{\tau \subset f} \beta(\tau, x) = \lim_{\tau \rightarrow f} \beta(\tau, x)$.

WB $\stackrel{\text{def}}{=}$ the collection of all such β 's.

(b) We say that β determines a **strong type-2 time bound** iff $\beta \in \text{WB}$ and satisfies:

Monotonicity: $\sigma \subseteq \sigma'$ implies $\beta(\sigma, x) \leq \beta(\sigma', x)$.

SB $\stackrel{\text{def}}{=}$ the collection of all such β 's.

TYPE-2 COMPLEXITY BOUNDS

Our approach, continued

DEFINITION.

- ▶ The run time of $\hat{\varphi}$ -program i on input (f, x) is **bounded** by β (written $\hat{\varphi}_{i,\beta}(f, x)\Downarrow$) **iff** for each n ,

$$\hat{\Phi}_i(\sigma_n, x) \leq \beta(\sigma_n, x), \text{ where } \sigma_n = \text{Use}_i(f, x, n).$$

- ▶ The computation of $\hat{\varphi}$ -program i on input (f, x) is **clipped** by β (written $\hat{\varphi}_{i,\beta}(f, x)\Uparrow$) **iff** not $\hat{\varphi}_{i,\beta}(f, x)\Downarrow$.

- ▶ $E_{i,\beta} = \{ (f, x) \mid \hat{\varphi}_{i,\beta}(f, x)\Uparrow \}$.

We call $E_{i,\beta}$ the **exception set** for i and β .

- ▶ The run time of $\hat{\varphi}$ -program i is **everywhere bounded** by β **iff** $E_{i,\beta}$ is empty.

EXAMPLE. Suppose $\hat{\varphi}_i$ is total and, for each σ and x ,

$$\beta(\sigma, x) = \hat{\Phi}_i(\sigma, x).$$

Then $\beta \in \text{SB}$ and (no surprise) the run time of $\hat{\varphi}$ -program i is everywhere bounded by β .

TYPE-2 ALMOST EVERYWHERE BOUNDS

The short version

Since we are working in function spaces,

finite \cong compact in some topology.

But which topology?

What we don't do: Use \mathcal{B} , the Baire space topology.

Why? $E_{i,\beta}$ is compact in \mathcal{B} iff $E_{i,\beta} = \emptyset$.

OUR APPROACH

DEFINITION.

(a) The induced topology for $\hat{\varphi}$ -program i (written \mathcal{I}_i) is ... not today ...

(b) $\hat{\varphi}$ -program i is almost everywhere bounded by β iff $E_{i,\beta}$ is compact in \mathcal{I}_i (iff there are only finitely many computations $\ni \hat{\varphi}_{i,\beta}(f, x) \uparrow$).

TYPE-2 ALMOST EVERYWHERE BOUNDS

The longer version

Since we are working in function spaces,

finite \cong compact in some topology.

But which topology?

DEFINITION.

(a) $((\sigma, x)) =_{\text{def}} \{ (f, x) \mid f \supset \sigma \}$.

(b) \mathcal{B} , the **Baire space topology** on $(\mathbb{N} \rightarrow \mathbb{N}) \times \mathbb{N}$, is the topology obtained by taking

$$\{ ((\sigma, x)) \mid \sigma \in \mathcal{F}, x \in \mathbb{N} \}$$

as basic open sets.

What we don't do: Use \mathcal{B} .

Why? $E_{i,\beta}$ is compact in \mathcal{B} iff $E_{i,\beta} = \emptyset$.

TYPE-2 ALMOST EVERYWHERE BOUNDS

Our approach

DEFINITION.

(a) The **induced topology** for $\hat{\varphi}$ -program i (written \mathcal{I}_i) is the topology on $(\mathbb{N} \rightarrow \mathbb{N}) \times \mathbb{N}$ determined by taking

$$\{ ((\sigma, x)) \mid (\exists f)[\sigma \subseteq \text{Use}_i(f, x)], x \in \mathbb{N} \}$$

as the basic open sets.

(b) $\hat{\varphi}$ -program i is **almost everywhere bounded by β** iff $E_{i,\beta}$ is compact in \mathcal{I}_i .

NOTE.

$\hat{\varphi}$ -program i is almost everywhere bounded by β
iff

there are only finitely many computations $\exists \hat{\varphi}_{i,\beta}(f, x) \uparrow$.

(Similar to some ideas of Symes (1971).)

TYPE-2 COMPLEXITY CLASSES FINALLY!

Recall the definition of a type-1 complexity class:

$$\mathcal{C}(t) =_{\text{def}} \{ \varphi_i \mid i \in \mathbb{N} \ \& \ \varphi_i \text{ is total} \ \& \ \Phi_i \leq^* t \}.$$

DEFINITION. For each $\beta \in \text{WB}$,

$$\widehat{\mathcal{C}}(\beta) =_{\text{def}} \{ \widehat{\varphi}_i \mid i \in \mathbb{N} \ \& \ \widehat{\varphi}_i \text{ total} \ \& \ E_{i,\beta} \text{ is compact in } \mathcal{I}_i \}$$

$\widehat{\mathcal{C}}(\beta)$ is the type-2 complexity class **named** by β .

SOME SAMPLE ELEMENTARY RESULTS

THEOREM (Li).

Suppose $F \in \widehat{\mathcal{C}}(\beta)$. Then there is a $\widehat{\varphi}$ -program i for F and a $c \in \mathbb{N}$ such that $E_{i,c,\beta} = \emptyset$.

THEOREM (Li).

Suppose $\beta \in \text{WB}$. Then there is an 0–1-valued total computable F such that $F \notin \widehat{\mathcal{C}}(\beta)$.

UNIONS OF COMPLEXITY CLASSES

THE SITUATION AT TYPE-1

THEOREM (McCreight & Meyer).

Suppose that $t: \mathbb{N}^2 \rightarrow \mathbb{N}$ is computable and nondecreasing in its first argument. Then there is a computable $g: \mathbb{N} \rightarrow \mathbb{N}$ such that $C(g) = \bigcup_i C(\lambda x . t(i, x))$.

COROLLARY. PF is a complexity class.

THE SITUATION AT TYPE-2

THEOREM (Li). BFF_2 is **not** a type-2 complexity class.

THEOREM (Li). Suppose $\beta_0, \beta_1, \dots \in \text{WB}$ satisfy some **very strong conditions**. Then $\bigcup_i \hat{C}(\beta_i)$ may **fail** to be a complexity class.

THEOREM (Li). Suppose $\beta_0, \beta_1, \dots \in \text{WB}$ satisfy some **even stronger conditions**. Then for some $\beta \in \text{WB}$, $\hat{C}(\beta) = \bigcup_i \hat{C}(\beta_i)$.

COROLLARY (Li). Suppose $\beta \in \text{WB}$. Then $\mathbf{O}(\beta)$ is a complexity class, where $\mathbf{O}(\beta) = \bigcup_{a,b \in \mathbb{N}} \hat{C}(a \cdot \beta + b)$.

GAPS AND COMPRESSIONS

THE SITUATION AT TYPE-1

THE OPERATOR GAP THEOREM (Constable, Young).

For each computable $\Theta: (\mathbb{N} \rightarrow \mathbb{N}) \rightarrow (\mathbb{N} \rightarrow \mathbb{N})$, there is an increasing, computable t such that $\mathcal{C}(t) = \mathcal{C}(\Theta(t))$, in fact, there is no i with $t \leq^* \Phi_i \leq^* \Theta(t)$.

THE COMPRESSION THEOREM (Blum).

There is a computable $r: \mathbb{N}^2 \rightarrow \mathbb{N}$ such that for all i with φ_i total, we have $C(\Phi_i) \subsetneq C(\lambda x. r(x, \Phi_i(x)))$.

THE SITUATION AT TYPE-2

Gaps go away.

THE INFLATION THEOREM (Li).

There is a recursive operator Θ such that, for each $\beta \in \text{WB}$, $\Theta(\beta) \in \text{WB}$ and $\hat{C}(\beta) \subsetneq \hat{C}(\Theta(\beta))$.

QUESTIONS AND DIRECTIONS

- ▶ The “natural” bounds tend to be strong bounds.
 - How strong are the **SB** versions of the type-2 union theorem? (Not very - Li.)
 - And similarly for the inflation theorem? (Very - Li.)
- ▶ If we are stuck naming big classes with unions, what is the theory of unions of type-2 classes?
- ▶ What about Constable’s Q2? ◀
- ▶ What about beyond type-2?
- ▶ Complexity + realizers?