Robert L. Constable

Department of Computer Science Cornell University Ithaca, N. Y. 14850

### Abstract

This paper gives an overview of subrecursive hierarchy theory as it relates to computational complexity and applies some of the concepts to questions about the size of programs in subrecursive programming languages. The purpose is three-fold, to reveal in simple terms the workings of subrecursive hierarchies, to indicate new results in the area, and to point out ways that the fundamental ideas in hierarchy theory can lead to interesting questions about programming languages. A specific application yields new information about Blum's results on the size of programs and about the relationship between size and efficiency.

#### § 1 Introduction

Consider a programming language  $\mathcal{L}$  such as reference Algol or LISP capable of expressing algorithms for all partial recursive functions  $\phi : \mathbb{N}^m \to \mathbb{N}$  where  $\mathbb{N} = \{0, 1, 2, \ldots\}$ . It is well-known that such languages have the capacity to express algorithms which produce astronomically large computations. In other words,  $\mathcal{L}$ contains algorithms for functions whose computation at any input would exhause all imaginable computing resources. Letting  $\mathcal{R}$  denote the class of all (total) recursive functions, this fact means that the functions "actually computed" belong to subrecursive classes,  $\mathcal{L} \subset \mathcal{R}$ . For instance there is reason to believe that all functions actually used in computing belong to  $\mathcal{R}^1$  the class of primitive recursive functions.<sup>†</sup>

<sup>†</sup> One can argue that only finite functions are "actually computed". However, for reasons of mathematical application a first approximation to actual computing should allow for the computability of infinite functions such as x+y, x·y, xY, etc. See Elgot & Robinson [10] and McCarthy [16] for a discussion of this point. It is in fact one of the tasks of computing theory to discover a class or classes of functions which adequately represents the functions actually computed. The class  $\mathcal{E}$  of elementary functions may be a more reasonable candidate than  $\mathcal{R}^1$ . Programming languages,  $\mathcal{L}_{\mathcal{A}}$ , can be designed which express algorithms only for the functions in a subrecursive class  $\mathcal{L}$ . These languages have been based on the logicians' formalisms for special classes like  $\mathcal{R}^1$ . In 1965 Cleave [5] designed a language for  $\mathcal{R}^1$  based on ideas in Grzegorczyk [12] (1953) while Meyer & Ritchie [18] (1965) designed another such language based on the ideas of R.M. Robinson [22] (1947) and P. Axt [2] (1963). Constable designed languages for  $\mathcal{R}^n$  (defined below) based on the notion of a stack [8] and of restricted program modification [7].

The subrecursive languages have several virtues. All programs terminate so there is no "halting problem". A bound for the running time of a program can be determined from the input and syntax. The conceptual structure of programs is simpler than the structure of general recursive programs.

Computational efficiency is not sacrificed for these advantages. In a forthcoming article, the author and Allan Borodin [9] show there is no significant loss of computational efficiency caused by computing with certain subrecursive languages. In Cleave's language the loss is at most a constant factor c of the total running time. In the case of various modifications of the "Loop" language of Meyer & Ritchie the loss is again at most a linear factor c, and for their original language the loss is at most a square factor.

What are the disadvantages of subrecursive languages? Blum [3] has shown that program compactness is sacrificed. He defines the notion of program size axiomatically. If i is a program, let |i| be its size. One valid measure of size is the <u>length</u> of a program (number of cards in the deck). Blum shows that if f is any recursive function, there is a primitive recursive function  $f_i$  whose minimum

length subrecursive program, say i<sub>o</sub> ,
satisfies

f(|j|) < |i<sub>o</sub>|

for j some general recursive program for  $f_i$ . So for  $f(x) = 100 \cdot x$ , there is some primitive recursive function whose shortest subrecursive program is 100 times longer than one of its general recursive

This research was supported in part by National Science Foundation Grant GJ-579.

programs. Furthermore, Blum shows that the computational complexity, say run-time, of j is nearly the same as that for i except on a finite set.

Blum's result seems to indicate that general recursive programming languages have a decided advantage over subrecursive languages. He argues this by saying "in order for programs to be of economical size, the programming language must be powerful enough to compute arbitrary general recursive functions".

In this paper Blum's result is examined further, and it is simply shown that there is a language for  ${\boldsymbol{\mathcal E}}$  (or for  ${\boldsymbol{\mathcal R}}^\perp$  ) such that any program which can be significantly compressed without drastically degrading computational efficiency must be a computationally complex program. The same results apply all through the known subrecursive hierarchies,  $\boldsymbol{\mathcal{E}}^{lpha}$  , and they apply to the interesting languages such as Meyer & Ritchie [18]. The result also shows that there is a trade-off relationship between size and computational complexity (measured without an a.e. condition). Such facts can be construed to mean that for the purposes of working in the usable levels of the elementary functions, there is a subrecursive language capable of expressing all elementary functions and there is a size measure on that language such that the usable functions cannot be significantly compressed without degrading efficiency.

These results indicate some of the uses of hierarchies. The classes  ${\cal R}^{lpha}$  -  ${\cal R}^1$ are not of interest because their functions will be used in computing but because they serve to measure the capabilities of languages and computing systems. Moreover, the specific principles on which the hierarchies  $\boldsymbol{R}^{\alpha}$  are constructed provide a fundamental description of recursive functions. Each function  $f \in \boldsymbol{\mathcal{E}}^{\alpha}$ can be represented in a normal form,  $f() = E[f_{\alpha}()]$  where E[]is an elementary operator and  $f_{\alpha}($  ) is an element of a sequence of functions defining a subrecursive hierarchy.<sup>†</sup> The complexity of f() has two components: its <u>height</u> represented by  $\alpha$  and its <u>width</u> represented by the elementary operator E[] (defined below). In the sections that follow, two specific programming languages, G and P,

or an algorithm. Operators from functions to functions are denoted by E[]. So E[f()](x) is the value of the image of f() at x.

will be defined and used to investigate the size results and to outline the development of subrecursive hierarchies. In addition, the subject will be treated from the viewpoint of abstract computational complexity. Hopefully such a treatment provides an easily intelligible overview of the subject, laying bare the methods and open problems.

# § 2 Programming Languages

# General Recursive Language.

The main results will be developed first for specific computing systems (language and machine) and later for acceptable indexings and Blum measures. The particu lar programming languages used are based on Shepherdson & Sturgis [26] and Cleave [5]. The language G , for General recursion, is defined as follows:

<constant> ::= 0|1|...|n|... <letter> ::= a|b|c|...|x|y|z <Letter> ::= A|B|C|...|X|Y|Z

<variable> ::= <Letter>|<Letter> <constant><sup>††</sup>

<binary operator> ::= +|x
<unary operator> :: = +1|-1

- <assignment> ::= <variable>+<term>
  <conditional> ::= if<variable>=0 then go
- to <label> else go to next statement.
  <label> := <constant>|<letter>|<letter>
  <label>
- <statement> ::= <assignment>; | <conditional>;
- <program> ::= <statement>|<label><state ment>|<program><program></program>

The conditional is usually abbreviated to "if then <label> "leaving the "go to" and "go to next statement" understood. For convenience, the conditional expression is used informally. The rule is

<conditional exp.> ::= if <logical> then
 <term> else <term> where <logical> infor mally represents a true or false state ment.

Examples: The following are G-programs.

1	$Z \leftarrow 0$ $S \leftarrow X$ if S = 0 then 2 $X \leftarrow X + 1$ $S \leftarrow S \stackrel{*}{\cdot} 1$ if Z = 0 then 1	$Z \leftarrow 0$ $N \leftarrow 1$ $S \leftarrow X$ $K \leftarrow 1$ I  if  S = 0  then  2 $K \leftarrow K + 1$ $N \leftarrow N \cdot K$ $S \leftarrow S \doteq 1$ if Z = 0  then  1
		if Z = U then I

The first program doubles the contents of X, the second computes X! . Notice that programs halt when they attempt to branch to an unlabeled statement. Also recall

<sup>&</sup>lt;sup>+</sup> The notation "f()" is used to indicate a <u>function</u> when the number of arguments is unimportant and when a single letter f might be construed as an integer

<sup>&</sup>lt;sup>††</sup> This notation takes liberties with BNF by allowing subscripts.

x'y = if x<y then 0 else x-y. It is assumed that the reader knows the semantics of such a language from sources such as [26], [10] or [25]. It is interpreted on a register machine (named for the fact that the computer words which are the interpretations of the variables, can be used for arithmetic directly without the intervention of special registers).

# Subrecursive Language

The subrecursive language relies heavily on its semantics. Consider the sequence of functions defined by

Def. 2.1  $f_0(x) = x+1$  and  $f_{n+1}(x) = f_n^{(x)}(x)$ 

where for any function  $f : \mathbb{N} \to \mathbb{N}$ , the iterate of f is defined by  $f^{(0)}(x) = x$ ,  $f^{(n+1)}(x) = f(f^{(n)}(x))$ . These functions have a particularly simple structure in terms of the standard high level iterative, such as the PL/1 DO, END pair. For instance, for an arbitrary G-program  $\pi$  let the code DO N π END exit be interpreted as S + N1 if S = 0 then exits + s - 1go to l where S does not appear in the program  $\pi$ . Thus for instance DO N N + N + 1 END will double the contents of N. The functions  $f_n$  () are computed in a canonical manner by the programs:  $f_0$  is  $X \leftarrow X + 1$  and  $f_{n+1}$  is DO X fn END. The syntax for the subrecursive language P is obtained by adding a "clock" to programs in G. Specifically <clock> ::= (<constant>,<constant>)
<P-program> ::= <clock>;<G-program>. The language P is interpreted on a Jlimited register machine as defined in Cleave [5]. Briefly the machine uses a special <u>clock</u> register J inaccessible to the program. When the program starts executing, J is given a positive value, n, and on every step J is decreased by one until either the program halts or J reaches 0. In the later case the program <u>halts ab-</u> normally, the output being whatever is in the output register at termination. A P-program with clock (n,p) will start

on input x with  $J = f_n^{(p)}(x)$  (or

$$J = f_n^{(p)} (\max\{x_1, ..., x_n\}) \text{ on input}$$
  
$$\bar{x} = \langle x_1, ..., x_n \rangle = N^n \rangle.$$

Let  $\phi_0, \phi_1, \dots, \phi_n, \dots$  be a standard

enumeration (more generally an acceptable indexing in the sense of Rogers[23]) of all G-programs and  $\alpha_0, \alpha_1, \dots, \alpha_n, \dots$  an enumeration of all P-programs. Let  $\sigma\phi_i(x)$  and  $\sigma\alpha_i(x)$  be the number of steps taken by  $\phi_i$  and  $\alpha_i$  respectively on input x. Let  $\phi_i(x)$  abbreviate the fact that  $\phi_i$  halts on input x, then  $\phi_i(x)$  means it does not halt. So  $\sigma\phi_i(x) = if \phi_i(x)$  then (number) of steps) else (undefined). By convention let  $\alpha_i = \langle (n_i, p_i, \beta_i \rangle$ 

(so that  $\beta_i = \phi_j$  for some j). Then notice

notice  $\sigma \alpha_{i}(x) = \min\{f_{n_{i}}^{(p_{i})}(x), \sigma \beta_{i}(x)\}.$ 

The symbol sigma,  $\sigma$ , represents a measure of complexity on  $\{\phi_i\}$  or  $\{\alpha_i\}$ . The list  $\Sigma_{\phi} = \{\sigma\phi_i\}$  is a complexity measure in the sense of Blum [4] (a Blum measure).

# § 3 Subrecursive Hierarchies Algebraic Approach One of the oldest and most influential

subrecursive hierarchies is the Grzegorczyk hierarchy first presented in [12] in 1953. This hierarchy has since been defined in several different ways, see [1], [2], [7], [18], [21]. Crucial to the definition is the concept of the set of functions elementary in f,  $\mathcal{E}(f)$ . The definition is sketched intuitively below so that the reader unfamiliar with the concept can see approximately what is involved. Let Q be the set of rational num-bers,  $Q = \{0,\pm 1,\pm 2,\pm 1/2,\pm 3,\pm 1/3,\pm 2/3,\ldots\}$ . Let  $\mathbf{\hat{y}}$  be the field of rational functions under + and • . Notice that the field is closed not only under + and • but also under the operation of substitution of functions for variables. Denote the operation of substitution by 0 's. Now extend the field  ${old S}_{oldsymbol Q}$  by closing under the infinitary ring operations  $s(x_1, ..., x_n, y) = \sum_{i=0}^{[y]} q(x_1, ..., x_n, i)$ 

$$p(x_{1},...,x_{n},y) = \prod_{i=0}^{[y]} q(x_{1},...,x_{n},i)$$

for i an integer variable.

For brevity let B be any set of functions and  $0_1, \ldots, 0_p$  any operators  $B^n \rightarrow B$ , then  $[B; 0_1, \ldots, 0_p]$  is the least class containing B and closed under  $0_i$ . The class of clementary functions over the rationals  $\mathcal{E}_{\boldsymbol{\alpha}}$ , is  $[\boldsymbol{\varphi}_{\boldsymbol{\alpha}}; 0s, \boldsymbol{\Sigma}, \boldsymbol{\Pi}]$  (a superfield of  $\boldsymbol{\varphi}_{\boldsymbol{\alpha}}$ ). The class of elementary functions over N, denoted simply  $\boldsymbol{\xi}$ , is obtained by relativizing  $\boldsymbol{\xi}_{\boldsymbol{\alpha}}$  to N. Succinctly defined, the class  $\boldsymbol{\xi}$  is given by letting

 $b_{-1}(x) = 0 , b_{0}(x) = x + 1 ,$   $b_{1}(x,y) = x + y , b_{2}(x,y) = x \cdot y,$  $b_{3}(x,y) = x^{Y} , B_{i} = \{b_{-1}, \dots, b_{i}\}.$ 

Then  $\boldsymbol{\xi} = [B_2; 0s, \Sigma, \Pi] = [B_3; 0s, \Sigma]$  and  $\boldsymbol{\xi}(f) = [B_2, f; 0s, \Sigma, \Pi]$ .

It is an open question of considerable interest whether  $\mathcal{E}_{\alpha}$  can be obtained from  $\mathcal{Q}_{\alpha}$  using only 0s and a sequence of new base functions, i.e. by a sequence of transcendental elements over the field  $\mathcal{Q}_{\alpha}$ .

The algebraic way of extending the class  $\boldsymbol{\mathcal{E}}$  to the larger class  $\boldsymbol{\mathcal{R}}^{1}$  is to use a sequence of "transcendental extensions" of  $\boldsymbol{\mathcal{E}}$  by functions  $h_{i}$ . A sequence of such extending functions,  $h_{0}, h_{1}, \ldots$  will be called a <u>spine</u> for a hierarchy up to  $\boldsymbol{\mathcal{R}}^{1}$  if  $\bigcup_{i=0}^{\infty} \boldsymbol{\mathcal{E}}(h_{i}) = \boldsymbol{\mathcal{R}}^{1}$ . For the sequence i=0  $f_{i}$  of Def.21<sup>†</sup> Theorem 3.1:  $\boldsymbol{\mathcal{E}}(f_{n}) \subset \boldsymbol{\mathcal{E}}(f_{n+1})$  for all

Theorem 3.1:  $\mathcal{E}(\mathbf{f}_n) \subset \mathcal{E}(\mathbf{f}_{n+1})$  for all n > 2. Letting  $\mathcal{E}^n = \mathcal{E}(\mathbf{f}_n)$  for  $n \ge 3$ 

<sup>†</sup>Grzegorczyk used a different sequence of functions,  $g_0(x,y) = y+1$ ,  $g_1(x,y) = x+y$  $g_2(x,y) = (x+1) \cdot (y+1)$  and for n > 2 $g_{n+1}(0,y) = g_n(y+1,y+1)$  and  $g_{n+1}(x+1,y) = g_{n+1}(x,g_{n+1}(x,y))$ . His classes  $\mathcal{E}^0 \subset \mathcal{E}^1 \subset \mathcal{E}^2 \subset \mathcal{E}^3 = \mathcal{E}$  are defined by 0s and limited recursion from  $g_1()$ . For i < 3 the  $\mathcal{E}^i$  are not of interest here because they are not of the form  $\mathcal{E}(f)$ . Theorem 3.2:  $\bigcup_{n=3}^{\infty} \boldsymbol{\xi}^n = \boldsymbol{R}^1$ .

These theorems are proved by routine rate of growth arguments. A function f is said to <u>majorize</u> a class  $\mathcal{C}$  (written f >  $\mathcal{C}$ ) iff for all g  $\in \mathcal{C}$  there is a p such that g(x<sub>1</sub>,...,x<sub>n</sub>) <

 $\begin{array}{l} f_n^{(p)} \left(\max\left\{x_1,\ldots,x_n\right\}\right) & \text{. The notation } f < \mathcal{C} \\ \text{means there is a } g \in \mathcal{C} & \text{and } f(x) < g(x) \\ \text{for all } x & \text{. It is shown by an inductive} \\ \text{analysis of the definition of } \mathcal{E}(f_n) & \text{that} \\ f_n & \text{majorizes } \mathcal{E}(f_n) & \text{. It follows that no} \\ \text{one argument function in } \mathcal{E}(f_n) & \text{can grow} \end{array}$ 

as fast as 
$$f_{n+1}(x) = f_n^{(x)}(x)$$
. Thus

Containment,  $\boldsymbol{\ell}^n \subset \boldsymbol{\ell}^{n+1}$ , is shown by giving an elementary scheme for defining  $f_n$  from  $f_{n+1}$ . A more intuitive approach to this step is discussed later. To prove the equality of Theorem 3.2,

To prove the equality of Theorem 3.2, Grzegorczyk used a formulation of  $\mathcal{R}^1$  in terms of iteration, due to R.M. Ribinson [22]. The functions  $f_n$  mirror the depth of nested iteration and this makes the argument straight forward. Once this theorem is available and the computational approach to  $\mathcal{E}^n$  developed, as below, it becomes an easy matter to relate other

hierarchies to  ${\cal R}^1$ 

The Grezegorczyk hierarchy  $\mathbf{E}^{n}$  was first given a computational interpretation by Cleave [5] and later by Meyer & Ritchie [18]. It was related to the Kleene subrerursive hierarchy [15] and to the depth of nesting of primitive recursion by Axt [1] and [2].

The class  $\mathcal{R}^1$  is but the first level in the oldest subrecursive hierarchy, Péter's [19] n-fold recursive functions  $\mathcal{R}^n$ . It was natural to ask whether Grzegorczyk's approach could be extended to  $\mathcal{R}^n$ . Robbin [21] answered the question for Grzegorczyk's hierarchy and Constable [7] answered the question for Cleave's computational version.

In terms of the algebraic approach, an extension procedure is quite naturally suggested. Simply consider a transfinite sequence of "transcendental elements". Thus for an ordinal  $\alpha$  let  $\alpha_n \neq \alpha$  be a fundamental sequence to  $\alpha$ , e.g.  $n \neq \omega$ ,  $\omega \cdot n \neq \omega^2$ , etc. Then new "longer" sequences are defined by the condition  $f_{\alpha}(x) = f_{\alpha}(x)$  for  $\alpha_x \neq \alpha$ .

Given the standard fundamental sequences

for ordinals  $\alpha < \varepsilon_{0}$  it is shown in Constable [7] that for  $\mathbf{g}^{\alpha} = \mathbf{g}(\mathbf{f}_{\alpha}) \quad \alpha < \varepsilon_{\alpha}$ Theorem 3.3:  $\boldsymbol{\xi}^{\alpha} \subset \boldsymbol{\xi}^{\beta}$  if  $\alpha < \beta < \varepsilon_{\alpha}$ . Robbin [21] showed that<sup> $\dagger$ </sup>  $\bigcup_{\alpha<\omega} \mathbf{e}^{\alpha} = \mathbf{R}^{n}$ . Theorem 3.4:

In both of these results, the properness condition,  $f_{\alpha} \notin \mathbf{E}^{\beta}$  if  $\alpha < \beta$ , is shown by a simple application of the growth rate arguments that Grzegorczyk used. The critical lemma is that  $f_{\alpha}$  is strictly in-

creasing for all  $\alpha$  and all x .

To prove that  $\boldsymbol{\mathcal{E}}^{\alpha} \subseteq \boldsymbol{\mathcal{E}}^{\beta}$ , a computational analysis is used rather than a syntactic analysis of recursion schemes. (The syntactic method would result from a direct attempt to generalize Grzegorczyk's methods.) A computational approach appears necessary when the functions reach the complexity of f . The next section will  $\omega^\omega$ consider the relationship between the Extended Grzegorczyk classes  $\mathcal{E}^{lpha}$  and measures of computational complexity.

## Computational Approach

The computational method of analyzing hierarchies depends on two basic principles. They are stated first for the time measure,  $\boldsymbol{\sigma}$  , and later generalized to restricted Blum measures.

Given f( ) , let  $\varphi_{\mathbf{f}}$  be a specific G-program for f().

Principle I: If  $g \in \boldsymbol{\xi}(f)$ , then there is a program  $\phi_g$  for g and an elemen-tary operator E[] such that  $\sigma \phi_g(x) < E[\sigma \phi_f()](x)$  for all x.<sup>††</sup>

This principle asserts that the computing system  $\{\phi_i\}$  operates in an elementary manner. That is, if g() can be defined by a sequence of elementary operations, then the computing system can mimic those operations so that the cost is within an elementary operation of the cost of some specific algorithm for f(). This principle is true for all existing models of computing systems, such as onetape or multi-tape Turing machines or Register machines. Indeed it is a good criterion by which to judge the system, "does it do elementary arithmetic in an elementary manner?"

Robbin used a different set of functions,  $W_{\alpha}(x) = 2^{x}$  and  $W_{\alpha+1}(x) = W_{\alpha}^{(x)}(1)$ . <sup>††</sup> E[] is an elementary operator if  $E[f()] \in \mathcal{E}(f())$  for all  $f() \in \mathcal{R}$ .

Principle II; If  $\sigma \phi_i < \boldsymbol{\mathcal{E}}(f)$ , then  $\phi_i \in \boldsymbol{\mathcal{E}}(f)$  .

This principle asserts that if there is a way to compute g() which is bounded by an elementary in f amount of time, then the function is elementary in f. This is less obvious than I. It was first noticed by Kleene for the notion of "pri-mitive recursive in". Indeed, it is a direct consequence of the Kleene Normal Form Theorem (NFT) [14] or [24] which asserts that any  $\phi_i \in \boldsymbol{\mathcal{R}}$  satisfies

$$\phi_{i}(\mathbf{x}) = U(\mu \mathbf{y} \mathbf{T}(\mathbf{i}, \mathbf{x}, \mathbf{y}, \mathbf{y})) \quad \mathbf{x} \in \mathbb{N}^{n}$$

where U( )  $\in \mathbf{E}$  and the "T-predicate" is elementary. Principle II follows from the fact that although the operation of minimum,  $\mu$ , is not elementary, the operation of <u>limited minimum</u>,  $\mu <$ , is. Therefore showing that  $\sigma \phi_i < \boldsymbol{\xi}(f)$  implies that

 $\phi_i \in \boldsymbol{\xi}(f)$  , since all the operations involved are elementary in f .

The fundamental fact behind the NFT is that the operation of the computing system can be described in an elementary manner. It is difficult to imagine a real computing system which does not posses an elementary description. See Cobham [6] for a discussion of this point.

The two principles apply to the analysis of the Extended Grzegorczyk hierarchy,

 $\boldsymbol{\mathcal{E}}^{\alpha}$ , in the following manner. Suppose each  $f_{\alpha}$  has the property

Operator Honesty Property: There is an algorithm, f , for f() and an elementary operator  $E_2[$  ] such that

 $\sigma \phi_f(x) < E_2[f()](x)$  for all x.

Then ovserve that for such f

 $g \in \boldsymbol{\mathcal{E}}(f)$  implies  $\sigma \phi_{i(\mathbf{x})} < E_1[E_2[f()]](\mathbf{x})$ for all x (by Honesty and I). So  $g \in \mathbf{g}(f)$  implies  $\sigma \phi_i < \mathbf{g}(f)$ . Now by II  $\sigma\phi_i < \boldsymbol{\mathcal{E}}(f)$  implies  $\phi_i \in \boldsymbol{\mathcal{E}}(f)$ .

Hence

Theorem 3.5: For f as above,  $g \in \boldsymbol{\mathcal{E}}(f)$  iff  $\sigma \phi_g < \boldsymbol{\mathcal{E}}(f)$ .

As long as  $f_{\alpha}$  has the (operator) Honesty Property and principle II holds, the question of membership in  $\boldsymbol{\xi}^{\alpha} = \boldsymbol{\xi}(f_{\alpha})$  is reduced to a question of estimating bounds. A crucial step in proving  $\boldsymbol{\mathcal{E}}^{\alpha} \subset \boldsymbol{\mathcal{E}}^{\beta}$  is the verification of honesty. Once this is accomplished, then the hierarchy can be analuzed by the simple technique of comparing growth rates, in particular showing that f majorizes  $\boldsymbol{\mathcal{E}}^{\alpha}$  .

It is easy to see that the run-time functions  $\sigma\phi_i$  satisfy a stronger honesty condition. First define Def. 3.1: f is h-honest iff  $\Xi\phi_i = f$ and  $\sigma\phi_i(x) < h(\phi_i(x))$  for all x. f is elementary-honest iff  $h \in \mathcal{E}$ . The  $\sigma\phi_i$  are elementary honest. This allows Theorem 3.6: If f has the (operator)

Honesty Property, then  $g \in \mathcal{E}(f)$  iff  $\sigma \phi_g \in \mathcal{E}(f)$ .

The proof follows by noticing that  $\sigma \phi_g < \mathcal{E}(f)$  and that honesty for  $\sigma \phi_g$  implies that there is a  $\phi_j = \sigma \phi_i$  and  $\sigma \phi_j < \mathcal{E}(f)$ .

#### Abstract Computational Approach

The abstract approach to computational complexity can be used to cast the previous observations in a more general setting. The abstraction begins with an acceptable indexing,  $\{\phi_i\}$ , as the generalization of a particular general recursive computing system. See Rogers [23] for a treatment of these indexings. Given  $\{\phi_i\}$ , a Blum measure of computational complexity is defined as a list of functions  $\phi = \{\phi_i\}$  such that there is a 0,1-valued recursive function M, and the following axioms are satisfied:

Axiom 1:  $\phi_i(x) \neq iff \Phi_i(x) \neq$ 

Axiom 2: M(i,x,y) = 1 iff  $\Phi_i(x) = y$ 

Example: The list  $\Sigma = \{\sigma \phi_i\}$  is a Blum measure.

The kinds of classes of interest here are the complexity classes of Hartmanis & Stearns [13] and their "everywhere" counterparts.

Def. 3.2: 
$$\mathcal{R}_{t}^{\Phi} = \{ \text{total } \phi_{i} | \Phi_{i}(x) \leq t(x) \\ a.e.x \}$$
  
 $\overline{\mathcal{R}}_{t}^{\Phi} = \{ \text{total } \phi_{i} | \Phi_{i}(x) \leq t(x) \text{ for all } x \}$ 

The a.e. (almost everywhere, i.e. except for a finite set) classes,  $\mathcal{R}_t$ , are most common in the literature of complexity theory, but the "everywhere" classes,  $\overline{\mathcal{R}}_t$ , will also be useful here. Following Blum, call the pair  $\langle \phi_i, \phi_i \rangle$ 

a machine class. Call the machine class elementary if the following additional axioms are satisfied for  $\phi_i$  and  $\phi_j$  total functions. Axiom 3: If  $\phi_i \in \mathcal{E}(\phi_j)$  then there is an elementary operator E[] and a  $\phi_k = \phi_i$  such that  $\phi_k(x) \leq E[\phi_j()](x)$  for all x.

Axiom 4:  $\Phi_i < \boldsymbol{\mathcal{E}}(\phi_i)$  implies  $\phi_i \in \boldsymbol{\mathcal{E}}(\phi_i)$ .

Axiom 5:  $\Phi_i$  are elementary honest, i.e. there is an  $h \in \mathcal{E}$  such that for all i there is a  $\phi_q() = \Phi_i()$ , and if  $\Phi_i(x) \neq$  then  $\Phi_q(x) < h(\Phi_i(x))$ .

Def. 3.3: Given an elementary machine class (emc),  $\langle \phi_i, \phi_i \rangle$ , call an ordinally indexed sequence of recursive functions,  $\{h_{\alpha}\}$ , an (elementary) spine iff

(i) each 
$$h_{\alpha}$$
 is strictly increasing

(ii) each h is elementary operator honest

(iii)  $h_{\alpha}(x) < h_{\beta}(x)$  for all  $x > N_{\alpha}$  if  $\alpha < \beta$ .

Theorem 3.7: If  $\{h_{\alpha}\}$  is an (elementary) spine, then  $g \in \boldsymbol{\mathcal{E}}(h_{\alpha})$  iff  $\exists \phi_g = g$  and  $\Phi_{\alpha} \in \boldsymbol{\mathcal{E}}(h_{\alpha})$ .

Def. 3.4: Call an (elementary) spine <u>nor-</u> <u>mal</u> iff  $h_{\alpha+1}(x) = h_{\alpha}^{(x)}(x)$  for all x. Note, supplying the initial value  $h_{o}(x) = x + 1$  generates the normal Grzegorczyk sping up to  $\omega$ .

Theorem 3.8: If  $\{h_{\alpha}\}$  is a normal spine over an emc, then

 $\mathcal{E}(h_{\alpha}) \subset \mathcal{E}(h_{\beta})$  for  $3 < \alpha < \beta$ .

The proof of this theorem requires properties (i) - (iii) of  $f_{\alpha}$ , Axiom 4 (principle II) and the standard techniques of growth rate analysis.

Given this theorem the question of whether an Extended Grzegorczyk type hierarchy exists up to an ordinal  $\alpha$  is reduced to the question of whether a normal spine exists up to  $\alpha$ .

Theorem 3.9: If 
$$h_{\alpha} \in \mathbb{R}^{\perp}$$
 and  $\{h_{\alpha}\}$  is a normal spine, then  
 $\bigcup \mathfrak{E}(h_{\alpha}) = \mathbb{R}^{\perp}$ .

Def 3.5: Call  $\{h_{\alpha}\} \alpha < \gamma$  an  $\varepsilon_{0}$ -standard spine if  $h_{\alpha}(x) = h_{\alpha}(x)$  for  $\alpha_{n} \neq \alpha$ the standard fundamental sequence to  $\alpha < \varepsilon_{0}$ .

Theorem 3.10: If  $h_o \in \mathbf{R}^1$  and  $\{h_\alpha\}$  is a normal  $\varepsilon_o$ -standard spine, then

$$\bigcup_{\alpha < \omega} \mathbf{\mathcal{E}}(\mathbf{h}_{\alpha}) = \mathbf{\mathcal{R}}^{n} .$$

Interesting relationships exist between elementary classes,  $\boldsymbol{\xi}(f)$ , and  $\Phi$ -complexity classes over an emc. For instance, if f is strictly increasing and  $f > \boldsymbol{\xi}$ , then f will majorize  $\boldsymbol{\xi}(f)$ . In fact a generalized Ritchie theorem holds.

Theorem 3.11: If f is strictly increasing, elementary operator honest over an emc and  $f > \mathcal{E}$ , then  $\underset{f(p)}{\mathcal{R}} \subset \underset{f(p+1)}{\mathcal{R}}$  and

$$\sum_{p=0}^{\infty} \mathcal{R}_{(p)} = \mathcal{E}(f)$$

Cor. 3.12: If  $\{h_{\alpha}\}$  is an elementary

spine and  $\boldsymbol{\mathcal{E}}^{\alpha} = \boldsymbol{\mathcal{E}}(h_{\alpha})$ , then if  $h_{\alpha} > \boldsymbol{\mathcal{E}}$ , then  $\bigcup_{p=0}^{s} \boldsymbol{\mathcal{R}}_{h_{\alpha}}(p) = \boldsymbol{\mathcal{E}}^{\alpha}$ .

All of these results follow by applying the general principles I and II (axioms 3 and 4) as they have been applied in the literature for the special cases. The difficult matter of showing that relatively long spines exist is put aside.

Another relationship between complexity classes and Grzegorczyk type classes is given by the Union Theorem of McCreight & Meyer [17]. Putting  $\boldsymbol{\xi}_{\alpha}^{n} = \boldsymbol{\xi}(h_{\alpha+n})$  and

$$\boldsymbol{R}^{\alpha} = \bigcup_{n=0}^{\infty} \boldsymbol{\mathcal{E}}^{n}_{\alpha}$$
 the theorem asserts

Theorem 3.13: For  $\{h_{\alpha}\}$  a normal spine over an emc, and  $\boldsymbol{\mathcal{E}}^{\alpha} = \boldsymbol{\mathcal{E}}(h_{\alpha})$  there are  $t_{\alpha}$  and  $u_{\alpha}$  such that  $\boldsymbol{\mathcal{E}}^{\alpha} = \boldsymbol{\mathcal{R}}^{\Phi}_{t_{\alpha}}$  and  $\boldsymbol{\mathcal{R}}^{\alpha} = \boldsymbol{\mathcal{R}}^{\Phi}_{u_{\alpha}}$ .

From the recent work of McCreight & Meyer [17] a very interesting type of spine emerges. It could be considered a "minimal" spine. First it follows from Blum [4] that any complexity class  $\boldsymbol{R}_{t}^{\Phi}$  named by an honest t can be extended by applying a "jump function" h() to t, i.e.,  $\boldsymbol{R}_{t}^{\Phi} \subset \boldsymbol{R}_{hot}^{\Phi}$ . The situation can be arranged so that

- (i)  $t_n(x) < t_{n+1}(x)$  a.e. x and  $R_{t_n} \subset R_{t_{n+1}}$ ; (ii)  $t_{n+1}(x) < h_1(t_n(x))$  a.e.x  $h_1(x)$
- $h_1() \in \mathcal{E}$ ,  $h_1()$  strictly increasing and  $h_2(t_n(x)) < t_{n+1}(x)$  a.e.x; (iii) each  $t_n$  is h honest for  $h \in \mathcal{E}$ .

At the limit stage the union theorem

Guarantees that  $\bigcup_{n=0}^{\infty} \mathbf{R}_{t_n} = \mathbf{R}_{u}$  for some

increasing u. The McCreight & Meyer [17] honest theorem guarantees that there is a measured set of functions  $\Gamma$  which can name every complexity class. In particular then there is an honest  $\mathbf{T}$  such that  $\mathcal{R}_{\mathrm{u}} = \mathcal{R}_{\overline{\mathrm{u}}}$ . The h in (ii) is taken to be an h for which  $\Gamma$  is h-honest. It appears possible that for u's constructed from an increasing sequence of the type  $t_{\mathrm{n}}$ ,  $\mathbf{T}$  can be made strictly increasing. If this is the case, let t  $t_{\omega}$  = strictly increasing  $\mathbf{T}$ . Then for each ordinal  $\gamma$  a minimal spine up to  $\gamma$ can be selected simply by choosing fundamental sequences for ordinals <  $\gamma$ . In particular there exists an  $\varepsilon_{\mathrm{o}}$ -standard minimal spine. Let  $\mathcal{R}_{\mu}^{\Phi}$  be the hierarchy  $\mu_{\alpha}$ 

produced by the minimal spine.

Unfortunately as the author has shown, even if minimal spines constructed via the McCreight-Meyer procedure do exist, they are so fine that

Theorem 3.14: If  $t_o \in \mathcal{E}$ , then for every constructive ordinal  $\gamma$ 

$$\cup \mathbf{R}^{\Phi}_{\mu} \subset \mathbf{\mathcal{E}} \cdot$$

#### § 4 Size of Programs

According to Blum [3] the notion of program size can be abstractly defined by specifying a size function  $||: N \rightarrow N$ which satisfies which satisfies condition 1:  $|| : \mathbb{N} \to \mathbb{N}$  is recursive condition 2:  $|y|^{-1}$  is finite for all y condition 3: there is a recursive function b such that b(y) is a bound on the cardinality of  $|y|^{-1}$ . Given a programming language (formalism)  $\{\boldsymbol{\varphi}_{i}\}$  , the size of a program (index) i is simply |i| , the value of the size function. As an example of a size function consider the following inductive definition of the <u>length</u> of a G-program. In  $(\langle Letter \rangle) = 1$ ,  $ln(\langle Letter \rangle_n) =$  $ln(\langle variable \rangle) = n + 1$ . If t is a term, say t = (a<operator>b) where a and b are terms, then ln(t) = ln(a) + ln(b) + 1. For assignment statements, ln(<variable>+<term>) = ln(<variable>) +
ln(<term>) + L . If L is a label formed by concatenating the labels  $L_1$  and  $L_2$ then  $\ln(L) = \ln(L_1) + \ln(L_2)$ , and ln(<letter>) = 1, ln(n) = n. Finally ln(if<variable> = 0 then <label>) =ln(<variable>) + ln(<label>) + 2 . The

length function, ln(), is a valid size function. From here on let || be the ln() size function.

The results of the hierarchy section show that "clock-bounded" formalisms simi lar to P can be defined for all classes  $\boldsymbol{\ell}^{\alpha}$ , more generally for any class  $\boldsymbol{\bar{R}}_{t}^{\Phi}$ . In particular, the clocks  $f_{3}^{(p)}()$  can be used to define a c.b. (clock-bounded) language for  $\boldsymbol{\ell}$ . The programs have the form <clock,G-program> where the clock is (3,p). Let  $\ell_{0}, \ell_{1}, \ldots$  be an enumeration of these programs (say E-programs), and let  $e_{i} = <(3, p_{i}), \beta_{i}$  where  $\beta_{i} = \phi_{j}$  for some G-program  $\phi_{i}$ .

A reasonable size function on E-program is

 $|\ell_i|_3 = p_i + |\beta_i|$ .

(notice there is a c, c =  $|f_3|$ , such  $|\ell_i|_3 + c = |\overline{\ell_i}|$  where  $\overline{\ell_i}$  is the G-program which first computes  $f_3^{(p)}(x)$  and then behaves like  $\ell_i$ .)

Because  $\boldsymbol{\mathcal{E}}$  is recursively enumerable and because all E-programs halt, it is possible to enumerate the shortest E-programs for  $\boldsymbol{\mathcal{E}}$ . Let  $m_0, m_1, \ldots$  be an enumeration of the shortest programs (thus  $m_0()$ ,  $m_1(),\ldots$  is an enumeration of  $\boldsymbol{\mathcal{E}}$ ). According to Blum [3], for each function  $f(x) = x + s \ s \in N$  there is some  $m_i$ and  $\phi_j$  such that  $m_i() = \phi_j()$  and  $f(|\phi_j|) \leq |m_i|_3$ . Without loss of generality assume  $f(|\phi_j|) = |m_i|_3$ , i.e.  $|\phi_j| + s = |m_i|_3$ . Say that  $\phi_j$  shrinks  $m_j$  by s.

Call an E-program p-complex iff p is the least j such that  $\sigma l_i(x) < f_3^{(j)}(x)$  for all x.

Theorem 4.1: Suppose that the program  $\phi_j$  shrinks  $m_i$  by s without loss of efficiency, then  $m_i$  is at least s-complex.

The proof is simple. Since  $m_i$  is the shortest E-program and  $\phi_j$  is efficient, the only way  $\phi_j$  can shrink  $m_i$  is by removing the clock. Thus the clock must be of size s, so  $s \leq p_i$ . That is,  $|\phi_j| + s = |m_i|_3 = p_i + |\beta_i|$ . If  $|\phi_j| < |\beta_i|$  then  $<(3,p_i), \phi_j >$  would be a shorter E-program for  $m_i($ ) because  $\sigma\phi_j(x) < f_3^{(p_i)}(x)$  for all x. Thus

 $|\phi_j| \ge |\beta_i|$ , so  $d = (|\phi_j| - |\beta_i|) > 0$ and  $s + d = p_i$ .

Observe that for fixed p, say a p determing the limit of the usable levels of  $\boldsymbol{\mathcal{E}}$ , the value q required to satisfy  $f_3^{(p)}(x) < f_n^{(q)}(x)$  decreases monotonically as n increases. Therefore there is an  $n_p$  such that  $f_3^{(p)}(x) < f_n(x)$  for all x. In the clock formalism for  $\boldsymbol{\mathcal{E}}(f_n)$ with the size measure  $||_n$ , the programs of  $\boldsymbol{\mathcal{A}}_{f_3}(p)$  cannot be shrunk by any G-program without loss of efficiency. The same results apply to any level of the hierarchy  $\boldsymbol{\mathcal{E}}_{\alpha}^n$  defined earlier.

These ideas can also be used to formulate a conservation or "trade-off" principle. Notice that if the level p of the Ritchie hierarchy,  $\cup \mathcal{R}_{\mathbf{F}_3}(\mathbf{p})$  can be enumerated, say p<sub>o</sub>,p<sub>1</sub>,... Then by Blum's result there is a G-program  $\phi$  which can shrink the size of some p by s , even for s >> p . Moreover this can be done without loss of efficiency except on a finite set S . According to Thm. 4.1, Blum's statement cannot be strengthened to hold everywhere. Stated in other terms Theorem 4.2: Programs in a fixed level p of the (generalized) Ritchie hierarchy for cannot be shortened with respect to  $||_{\alpha}$ more than p without loss of efficiency at least on a finite set S . For any s there are programs which can be shortened by s with a loss of efficiency equal to (s - p) , i.e. the shorter pro-gram must be (s-p)-complex at least on a finite set S .

Thus when computational complexity is measured by an everywhere condition, a conservation principle holds between size and efficiency.

#### Acknowledgments

The author would like to thank Dr. Allan Borodin for his helpful discussions about this paper, especially for his help and independent conclusions on minimal spines. Special thanks go to Pat Hauk for her excellent typing work.

#### References

- Axt, Paul "Enumeration and the Grzegorczyk hierarchy," Z. Math Logik Grund.Math 9 (1963), 53-65.
- 2]. Axt, Paul "Iteration of primitive recursion," abstract 597-182, Notices A.M.S., Jan. 1963.
- 3]. Blum, M. "On the Size of Machines," Information and Control, II, (1967), 257-265.
- 4]. Blum, M. "Machine-Independent Theory of the Complexity of Recursive Functions," JACM, 14, (1967), 322-36.
- 5]. Cleave, John P., "A Hierarchy of Primitive Recursive Functions," Zeitschr. F. Math Logik and Grund. D. Math., 9, (1963), 331-345.
- 6]. Cobham, Alan "The Intrinsic Computational Difficulty of Functions," Logic, Methodology and Philosophy of Science, Amsterdam, 1965.
- 7]. Constable, Robert L. Extending and Refining Hierarchies of Computable Functions. Comp. Sci. Tech. Report #25, Univ. of Wisc., 1968.
- 8]. Constable, Robert L. "Subrecursive programming languages for R<sup>n</sup>," Comp. Sci. Tech. Report 70-53, Cornell Univ., 1970.
- 9]. Constable, Robert L. and Allan B. Borodin "On the efficiency of programs in subrecursive formalisms," Comp. Sci. Tech. Report 70-54, Cornell Univ., 1970.
- 10]. Elgot, C. C. and A. Robinson "Random-Access Stored Program Machines, An Approach to Programming Languages," J.A.C.M., 11, (1964), pp. 365-399.
- 11]. Fabian, Robert J. <u>Hierarchies of</u> <u>general recursive functions and</u> <u>ordinal recursion</u>, Ph.D. Diss. <u>Case Inst. of Tech.</u>, 1965.
- 12]. Grzegorczyk, A. "Some Classes of Recursive Functions," Rozprawy Matematcyzne, (1953), 1-45.
- 13]. Hartmanis, J. and R. E. Stearns "On the Computational Complexity of Algorithms," Trans. AMC, 117, 5, (1965), 285-306.
- 14]. Kleene, S. C. <u>Introduction to</u> <u>Metamathematics</u>, Princeton, 1952.
- 15]. Kleene, S. C. "Extension of an

Effectively Generated Class of Functions by Enumeration," Collog, Math. 6, (1958), pp. 67-78.

- 16]. McCarthy, John "A Basis for a Mathematical Theory of Computation," <u>Computer Programming and Formal</u> <u>Systems</u>, Amsterdam, 1963, pp. 30-70.
- 17]. McCreight, E. M. and A. R. Meyer "Classes of computable functions defined by bounds on computation," ACM Symp. on Theory of Computing, 1969, 79-88.
- [18]. Meyer, A. R. and D. M. Ritchie "The complexity of Loop programs," Proc. 22 National ACM Conf. (1967), 465-470.
- 19]. Péter, Roze <u>Recursive</u> Functions, 3d ed., New York, 1967.
- 20]. Ritchie, Robert W. "Classes of Predictably Computable Functions, Trans." A.M.S., 106, 1963, pp. 139-173.
- 21]. Robbin, Joel <u>Subrecursive hier-</u> archies, Ph.D., Diss, Princeton, 1965.
- 22]. Robinson, R. M. "Primitive recursive functions," Bull AMS, 53, (1947), 915-942.
- 23]. Rogers, H. "Gödel numberings of partial recursive functions," J.SL, 23, 3, (1958), 331-341.
- 24]. Rogers, Hartley Jr. <u>Theory of Re-</u> cursive Functions and <u>Effective</u> <u>Com-</u> putability, New York, 1967.
- 25]. Scott, Dana Some Definitional Suggestions for Automata Theory, J. Compts., & Syst. Sci., 1, (1967), pp. 187-212.
- 26]. Shepherdson, J. C. and H. E. Sturgis "Computability of Recursive Functions," J.A.C.M., 10, 1963, pp. 217-255.