

# exposition

cover definitions:

note that this is not meant as an explanation of an inductive term

1)

~~Abstract~~ abs: set of objects in spacetime that are

abs: | to be considered "the same" ordered set of objects

2)

n tuple set:  $n \times p, n \times p \times t$

ordered set of relative coords.

3)

structure:  $S, S \times S, S \times S \times S$

several  
Give examples of each. Show by examples that an abs may be a large # of objects in a config. - that an n tuple may have, for its elements, any object, ~~no~~ matter how complex.



In 1), "Abstraction" is not a good word to use.

perhaps n-gram would be O.K.

Note that these dots are complementary



2 scient. problems.

1 example learning.  
- how a single example may suggest soln. to search process which gives new gp. that solves prob.

For talk: Make up examples

Heuristic Approach: from th. beginning:

Start with simplest induction problems from everyday life:

\*1) E.G. A bus has <sup>here</sup> ~~some~~ <sup>new language</sup> ~~some~~ <sup>holes</sup> ~~some~~ <sup>Give problem</sup> ~~some~~ <sup>Give example of</sup> ~~some~~ <sup>is. when tested, they prove useless.</sup> ~~some~~ <sup>Perhaps discuss</sup> ~~some~~ <sup>ad-hoc gps.</sup> ~~some~~ <sup>Bring out pt. that problem is</sup> ~~some~~ <sup>science is to form ~~good~~ gps that have ~~to~~ reasonable</sup> ~~some~~ <sup>probly. of being good - that usually ~~testing~~</sup> ~~some~~ <sup>show how this is true ~~rather~~ as</sup> ~~some~~ <sup>well as physics, and soc. sci.</sup> ~~some~~ <sup>their address is routine.</sup>

That this is main prob. of most science

\*2) ~~More~~ ~~easy~~ Induction in everyday life of more complexity, involving complex abs. - linear eqns. E.G. Man with bk. hat in T.V. is "bad": That ~~control~~ you don't like certain foods.

Psychon. abs. resulting in neurosis. eg. Birds.

Gen. Problem: that gn. a device (adding machine) <sup>T.M. will learn to produce output</sup> Say: I will give

\*3) Simple arith. learning on intuitive examples intuitively, ~~then~~ Then I will go into more detail on how machine ~~write~~ <sup>write</sup> implement these abs.

Explain closeness idea: [2 abs. are "close" if <sup>2 objects close if in same gp.</sup> <sup>2 ops are close if ~~of~~</sup> <sup>implies by ~~of~~</sup> <sup>of other</sup>]

Some kinds of closeness: a) physical closeness (e.g. continuous space problems, and ~~related~~ geom. metrics how ~~extra~~ p. to some ~~discrete~~ cases)

b) isomorphism and how an isomorphism defines idea of a str. and a ntpst. (th. arg. of th. str.)

c) Some simple kinds of closeness of str.

d) " " " " " " " ntpsts.

Give examples from everyday life and from Math. eg. indiv. members are close,

e) How to generate new str. and ntpsts and ngs from old - what this means in intuitive problems.

How this T.M. program might be used to teach children

How T.M. operation corresp. to devising of word in lang. i.e. a) testing of U. of idea. b) Inventing word c) that <sup>hypotheses</sup> ~~concepts~~ using few words ~~to~~ (simplicity) have least a prop. start with (dim. ngs. and str. : extend to 2 dims.  $\sqsubset$  permutation, repetition, omission.

Topics for talk: Tues July 10, 1956, Dartmouth

- 1) 2 kinds of sc. problems:
  - a) If  $\alpha$  happens, what will follow? (pure sc.)
  - b) If I want  $\beta$  to happen, what must I do to bring it about (Engng -  $\equiv$  inverse of (a))
  
- 2) a) Example of Bus at 9 A.M. or show how one groups phenomena for prediction.
  - b) Example of Linearity of equ.
  - c) Example of Isomorphism between Electric Filters, mechanical / acoustic filters.
  
- 3) Some examples of poor gps.
  - a) Bus without 9 A.M. in description.
  - b)
  
- 4) That most imp. work in sc. is devising categories - that correl. of cause and effect is routine and need not be done very well. Poor statistics will slow down predictions, and decrease accuracy somewhat, but poor gps. will ruin make prediction very poor.
  
- 5) Some methods of forming gps. directly.
  - a) Same object except for time, or space displacement.
  - b) Same except for small continuous distortion.
  - c) " " " " <sup>small</sup> omission, or addition.
  - d) Gave rise to "same" effects [ chemicals, operational similarity ]
  - e) Have similar cause [not so common]
  - f) Have " structure (isomorphism) electrical  $\rightarrow$  acoustic analog ]
  
- 6) Methods of combining ~~g~~ gps. to form new gps. of ~~hyp~~
  - a) Boolean mult: e.g. red apples
  - b) Boolean addition (not too useful)
  - c) Combining structures and ordered sets of elements.
  - d) concatenation.
  
- 7) General scientific scheme is Ocean's razor I.E. Th. simplest hypothesis is most likely aptiori. That this means simplicity in terms of existing lang.
  - a) Take old words, <sup>and concepts</sup> in lang, combine to form hypotheses, or new <sup>tentative</sup> words and concepts
  - b) Test hypothesis, concepts, words for usefulness in prediction.
  - c) Give useful concepts hyp names, so that they have by combination proby. in next time around.

### Topics for talk.

- 8) Scheme to be used in prediction:
- a) ~~Answer~~ start with categories.
  - b) test categories for U in prediction.
  - c) combine " of hy U to find new **trial** categories.
  - d) test new cats. for hy U in prediction.
  - e) etc.

9) An example: **Printed English.**

- a) Use of ngrams in prediction.
- \* b) Formation of longer ngrams by combining smaller ones i.e. concatenation of "words". [imp. method of cat. formation]
- c) sentences: Th. ~~AAAA~~ Question, Answer predictor.

#### Technique

How old is J.? : J is 10 yrs. old.  
 " " " B? : B " ~~very~~ "  
 " " " A? : A " 7 months "

Gen. form: How Old is  $\alpha$ ? :  $\alpha$  is  $\beta$  old.

Idea of structure as permutation, repetition, omission.

$$\sum_{i=1}^n (How, Old, is, \alpha, \beta) = \begin{matrix} How & Old & is & \alpha & \beta \\ \alpha & \alpha & 7 & 4 & 7 & 5 & \alpha \end{matrix}$$

$$\sum_{i=1}^n (1, 2, 3, 4, 5) = \begin{matrix} 1 & 2 & 3 & 4 & 4 & 3 & 5 & 2 \end{matrix}$$

Ntuple set. (How, old, is,  $\alpha_1$ ,  $\beta_1$ )

some  $\alpha_i, \beta_i$  pairs:  
 J, 10 yrs  
 B, very  
 A, 7 mo.

c) We now have **Str.**, **Ntpsts**

- We can make new cats. by ~~deriving new str's~~
- ① deriving new str's. from old
  - ② deriving new ntpsts. from old. ~~deriving~~

10) Another example in 2 dims:

Is rather general prediction problem: can be that of a device that watches a black box's input, output, then can, itself, reproduce same output for same input.

2) ~~Generalized~~ Arithmetic.

$$\begin{matrix} = 1011 \\ 1011 \end{matrix}, \quad \begin{matrix} = 0100 \\ 0100 \end{matrix}, \quad \begin{matrix} = 1001 \\ 1001 \end{matrix}, \quad \begin{matrix} = 1101 \\ 1101 \end{matrix}$$

- ① Use of monograms ~~instead~~ of low U in prediction.
- ② " " digms  $\square, \square, 1, 0$  is very useful.

**(b) Put diagram of flow Chart on Board**

topics for  $k$

10) b)  $\sim 1011$ ,  $\sim 0100$ ,  $\sim 1001$ ,  $\sim 1101$   
 $0100$ ,  $1011$ ,  $0110$ ,  $0011$

- ① ~~Trigrams~~ No digrams work for both = and  $\sim$
- ② ~~Trigrams~~ Some trigrams work part of th. time.  
e.g.  $\begin{matrix} 1 \\ 0 \end{matrix}$ ,  $\sim \begin{matrix} 1 \\ 0 \end{matrix}$ ,  $\begin{matrix} 0 \\ 0 \end{matrix}$ ,  $\sim \begin{matrix} 0 \\ 1 \end{matrix}$ , etc.

- ③ Tetragrams work all th. times.  
e.g.  $\begin{matrix} 1 & 0 \\ 1 & 0 \end{matrix}$ ,  $\begin{matrix} 0 & 0 \\ 0 & 0 \end{matrix}$ ,  $\begin{matrix} 1 & 1 \\ 0 & 0 \end{matrix}$ ,  $\begin{matrix} 0 & 0 \\ 0 & 0 \end{matrix}$  etc.

- ④ ~~How to use str.~~  
Intuitive feeling that e.g.  $\begin{matrix} 0 & 0 & 1 \\ 0 & 0 & 1 \end{matrix}$  should be imp.

- ⑤ Method of getting this using strs.  
② Define str. as  $\neq$  dim. perm, concatenation, repetition, omission.

Notations:

- $\begin{matrix} 0,0;0,1 \\ 0,0;1,0 \end{matrix} \cdot (\alpha, \beta) \equiv \begin{matrix} \alpha & \beta \\ \alpha & \beta \end{matrix}$
- $\begin{matrix} 1 & 2 \\ 2 & 1 \end{matrix} \cdot (\alpha, \beta) \equiv \begin{matrix} \alpha & \beta \\ \beta & \alpha \end{matrix}$
- $\begin{matrix} 2 \\ 1 \end{matrix} \cdot (\alpha, \beta) \equiv \begin{matrix} \beta \\ \alpha \end{matrix}$
- $\begin{matrix} 2 & 1 \end{matrix} \cdot (\alpha, \beta) \equiv \begin{matrix} \beta & \alpha \end{matrix}$

⑥ start with monograms, useful digms. i.e. cont. product of  $\begin{matrix} 0 \\ 0 \end{matrix}$ ,  $\begin{matrix} 1 \\ 1 \end{matrix}$ ,  $\begin{matrix} 0 \\ 1 \end{matrix}$ ,  $\begin{matrix} 1 \\ 0 \end{matrix}$ , =,  $\sim$ , 0, 1 with itself.

⑦ Mult  $\uparrow$  by  $S_1 \equiv \begin{matrix} 1 & 2 \end{matrix}$ : we get 128 ugms (ambig) only 32 occur, only 24 contain inter. sqw. ~~24~~ tri of these 24, 8 are useful. i.e. 1 in 3, which is very good.

See 18.12 for these useful trigrams.  $\leftarrow$

~~these~~ these trigrams =  $S_1 \cdot N_1$  where  $N_1 \equiv$

we may modify  $S_1$  and try slight variations: see P 22 for examples.

Th. last 3 ( $S_6, S_7, S_8$ ) are of  $hy U$   
we get 8 trigrams of  $hy U$  (see bottom of P22)

similarly we can get  $\begin{matrix} 0 & 0 & 1 \\ 0 & 0 & 1 \end{matrix}$ , etc.

### Topics for Talk.

#### 11) Present progress:

- a) up to normal binary addition.
- b) expect signif. modification of methods in future

#### 12) Future

- a) will try to stick to intuitive xfms.
- b) ~~More Math~~ ~~More~~ Much Math, and then teach simple lang. — say Q-A game.
- c) Originality will appear soon in separate M&R operations  
 e.g. literal soln. of alg. eqns; numerical solns.; ~~numerical~~ numerical interp.; extrapol. of functions (say  $\sin x$  to several cycles!)  
 differentiation; integration, etc. [see PX730 for list]

#### 13) ~~Criteria~~ Criterion of real learning:

When one can feed T.M. learning seq.  $\sim$  to that for human, and have it learn ~~and when~~ providing one hasn't inserted any new ad-hock devices for a long time.

This may be rather soon.

I.E. Draw General expected history of T.M.

— Many ~~ad-hock~~ ~~device~~ new devices at beginning of T.M. seq. — then they will become less and less frequent — and perhaps stop — and still T.M. will be able to learn new things

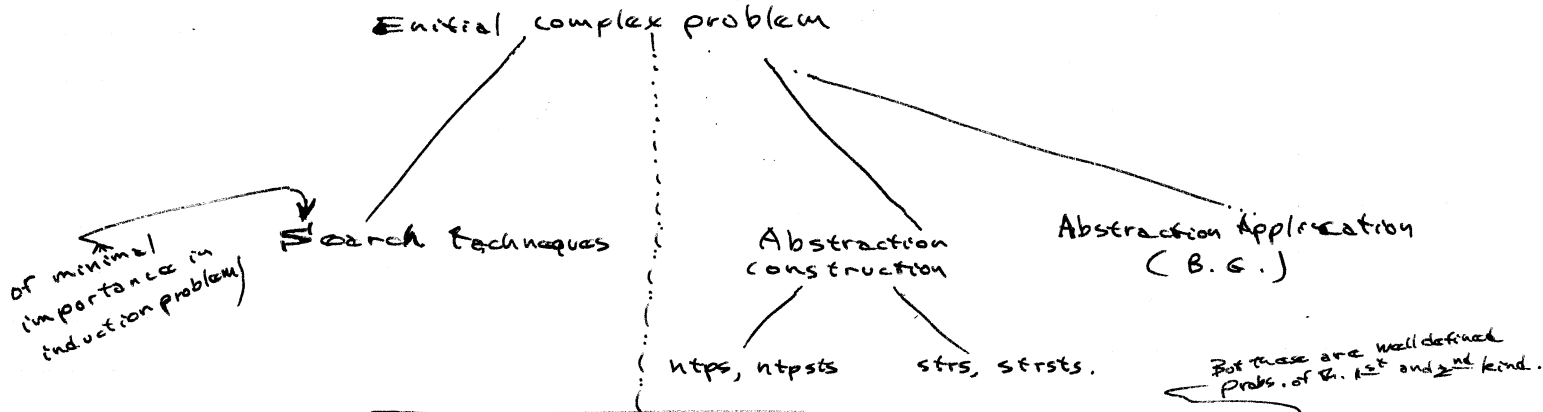
SN

SN's

1

1. A much more heuristic approach is needed. The presentation should make the problem <sup>to be solved</sup> clear at each point, and it should be clear ~~to~~ that what I am proposing is an attempt to solve it. Perhaps more examples of what I am trying to solve - at each point - would be helpful.

Breakdown of T.M. type problems:



Abs. construction may involve some searches occasionally; these can be done by 1) A Black box 2) An actual exhaustive search.

- For induction problem: The followed points should be made clear in this order:
- 1) That the main problem is abs. construction, and that abs. ~~is~~ ↔ sets of objects. (Give examples - in particular, how ngrams ~~are~~ → sets)
  - 2) Some simple ways of constructing sets (compact ngrams).
  - 3) Factoring old, useful sets into sub-elements (i.e. strs, ntps), recombining sub-elements into new trial sets, or new sub elements.
  - 4) Testing the new trial sets, new sub-elements
  - 5) ~~Repetition of 3~~ Repetition of 3, then <sup>4 times</sup> (Note this program loop)
  - 6) Dev. of standard methods of use of ABS (B.G.)

a) A more detailed order of presentation!

- 1) The idea of <sup>frequency of an element</sup> an ngram → give examples from a) Printed English, b) the math. problem with digrams, c) how this is an example of the gen. epist. post. that the causes of an event tend to be close to it in time and space.
- 2) as an example, perhaps of the epist. law: "Things tend to remain the way they were" (Not too good an example - one is just assuming the statistics remain the same - which one does for any other abs. anyway.)

# Un ordered Remarks

methods of generating gps.

How grouping methods / are a deterministic system, ~ to an axiom system.

As such, they ~~to~~ all have limitations. ~~the~~

That certain any grouping method ~~will~~ will be restricted to a certain universe of phenomena that it can ~~work~~ work with. (predict).

That we will concern ourselves with an attempt to ~~obtain~~ obtain a small set of methods that are sufficient to cover the phenomena of the universes we are familiar with.

~~on use of blank for examples is poor: will not solve A:B vs R:D - i.e. pick another ntp. from gfp. for completion.~~

~~On "Closeness": 2 kinds of closeness.~~

~~1)  $\approx$  On low, phenomenological level. 2 phenomena are ~ if it is useful to gp. them for prediction purposes. So we have ~ity with resp. to various "properties"~~

~~2) 2 gps are "close" if by U of one suggests by U of other. Here we have only one "property" of interest, i.e. by U we may find others. i.e. feasibility in combining them in certain ways.~~

~~3) It is probable that we will need hyper order methods of grouping.~~

~~i.e. we have sets of phenomena, sets of sets of phenomena, and sets of sets of sets of sets of phenomena ... etc. This can be ~~well~~ dealt with in a machine that ~~can~~ ~~handle~~ ~~many~~ ~~levels~~ ~~of~~ ~~abstraction~~ - as, I think, ~~humans~~ ~~often~~ ~~do~~. Give examples of sets, sets of sets~~

~~One can simply treat the "sets" problem as any other T.M. induction problem - or perhaps the "set of sets" problem in this way.~~

~~The concept of "Number": This can be done in a simple, Russell way: i.e. the set of all triples is related to the set of all pairs, and the set of all quadruples.~~



insert B ~~AAAAA~~

f. A simple type of ~~mathematical~~ mathematical learning.

The organism is presented

Partial Ordering of operations:

initial

ngms from initial str. ga.

- 1) ~~digit~~ Freq. count
- 2) digram. freq. counts
- 3) trigram " counts
- 4) Tetragram " "
- ...
- ngm. " "

1) ~~Creation of ntpsts by cart. products of ngms of hy U~~

~~b) initial str.~~

2) Mult. of str. by ntpsts to form ngmsts.

~~Use of neighboring str.~~

1) combining str. to obtain ~~new~~ hy <sup>hyu</sup> & priv str.

a) by trying "neighborhood" str

b) multiplying str

and strsts.

times str and strsts to obtain new str

a.g.  $\begin{pmatrix} 1 & 2 \\ 1 & 2 \end{pmatrix} \times \begin{pmatrix} 2 \\ 1 \end{pmatrix} = \begin{pmatrix} 1 & 2 \\ 1 & 2 \end{pmatrix}$

$\begin{pmatrix} 2 & 3 & 4 \\ 1 & 3 & 4 \end{pmatrix}$  or  $\begin{pmatrix} 2 & 3 & 4 \\ 1 & 3 & 4 \end{pmatrix}$

2) combining ngms, ntpsts to obtain new ntpsts. ngms.

a) cart. product.

b) function c) others.

Use of testcup. as black box, in which one puts gps. and their params., and output is U and other params.

Another x form to create new ntpsts from old:

Q. "function" idea. It is a comb. of 2 relations:

i.e. if  $(a_i, b_i)$  and  $(c_j, d_j)$  are 2 ntpsts,

then they combine to form

an ntpst  $(a_i, b_i, d_j) = (a_i, c_j, d_j)$  whenever

for all  $i, j$  where  $b_i = c_j$ .

There is the generalized idea of inversion, which implies a search. It isn't clear that it is trivial.

### Search Problems: imp.

- There are 2 problems in search
- 1) Given a present situation [ present states plus final goal ] what should be next sub-goal?
  - 2) Given a present state and a sub-goal, what xfun should be used next?

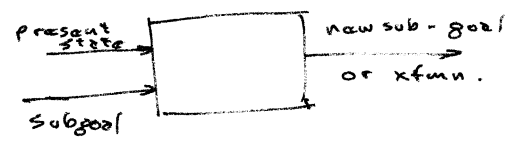
1) The present state, and the final goal, are described in terms of characters (abstractions). The next sub-goal will be described in terms of characters. What we want, is an operator on the present state, that gives the sub-goal. This operator will be a function of the characters of the present state and the final goal.

2) Here we assume that we want no more sub-goals between our present state and the sub-goal we have just chosen.

(50) We divide our operations into a) choice of sub-goal, b) attempt to reach sub-goal c) decision after each few steps whether to continue toward same sub-goal, or devise new sub-goal. One may routinely apply the procedure of c) to all steps - usually, the same sub-goal will be indicated at each pt. in the process (?).

**Elementalization:** From init. state and final goal, to devise sub-goals. To then try to achieve goals. At each point, one puts present state and sub-goal into a box: at output is either next xfun, or a closer sub-goal.

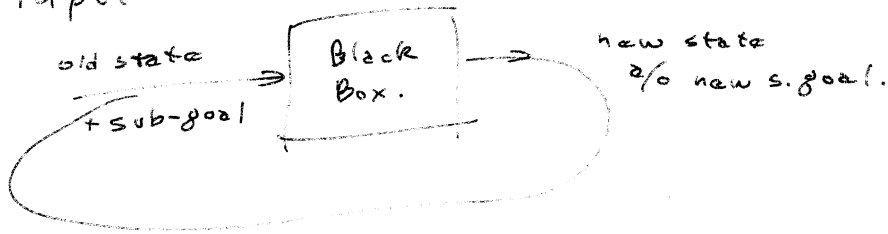
How the box works: Each present state and sub-goal is given characters. The output of the box is a) a sub-goal or b) a xfun.



At any rate, the output of the box is a xfun to be applied to the present state + subgoal.

## Search problems.

Sometimes  $P_t$ . present state is changed, sometimes  $T_t$ . goal is changed.  $T_t$ . output then is fed-back to  $T_t$ . input



- Black box contains
- 1) characterizer of inputs
  - 2) Set of xfmns that may be applied to input.
  - 3) ~~Search~~ Device for keeping score - i.e. which xfmns have most success with which input characters.

~~Device may just~~

4) When device reaches a ~~sub~~<sup>sub-</sup>goal, its next goal becomes  $T_t$ . one that was selected for it before.

5) The device may simply keep on ~~trying~~ finding new xfmns and sub-goals. To put a stop to this, each sub-goal should have a time limit. When this time limit is exceeded, ~~an~~ an alternative sub-goal or xfmn is tried.

6) Minsk also suggests a time limit for  $T_t$ . pursuit of each goal ~~or~~<sup>or sub-goal.</sup> then going on to  $T_t$ . next, ~~most~~ most probable goal or subgoal. 2. this could be analysed in some detail.



