

IRE talk

2) Examples of simple induction probs. in which there is ^{one and only} ~~starting~~ and correct answer. Simple Arith.

a) Show slide #1. — with = probs.

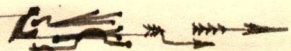
b) Introduce concepts of pugn. and "consistency".

c) Show slide #2 — ($\oplus$ and $\otimes$) — give quick explanation. introd pugnsts

5) Basic Idea: formation of Good Ngunsts. — That 1st law of Thermo (as was mentioned) is expressible as an ngust.

6) Start with ~~B~~ basic set of abss. — These are ngusts and other objects — strs, ntps, ntpsts.

Try Br. ngusts on probs gn. to machine: Good ones retained, rest discarded.

10) ⑤ all well so much for general theory: now just what has been done? 

a) A ~~program~~ program written for a machine able to learn simp. arith. from series of examples. This machine uses only a few abs. types, and methods of creating Show, perhaps, slide on Boolean probs. ^{new abss.}

20 In almost suff detail for

b) Some work done on mechanisms of ^{more complex} machines to work more diff. probs.

i) e.g. $+$ in some detail. Uses concept of pugnst, and a few other sets of abss. Slide #3.

ii) Machine to ~~recog~~ recog. Grammar (Ghom II and III)

would probably ~~at~~ device and use Chom's abss. for Ch. II

" " " abs diff. from Choms in ch. III.
~~This~~ This would be stoch. machine. - would also
 give "gram vits" but meaningless or false sentences,
 low prob. will not disting. betw. vits grammar and
 vits meaning. Also stoch. machine ~~some~~ indep. of errors in input.
 iii) Sets of sets avail, but no probs. ~~not~~ worked
 on in which Ray are nec.

⑥ What are main probs:

a) Are abs., and methods of gen. from suff. for all probs. of
 int. " (Ray can't be "complete", but are they fairly good?)

b) Th. search prob. : is most imp. ^{diff.} present prob.
~~exhaustive search~~ search O.K. in Samp. Mach. - but not in more complex - how to solve

Th. search prob. (be sure they understand what ^{search} prob. is)
 Th. search prob. is quite new to the ^{trial} prob. of constructing new obs. from old.
 Idea is: Once one has a search method, one can evaluate its
 effectiveness and speed. Start with a method that works

loosely speaking: start with one or more search methods that are known to be

good (~~the~~ - builtin)

Combine these and x for these various ways, to produce
 new trial search methods.

Eval. these. found

Adding R. new ^{found} bunch of good search methods to R. old

Stack, combine and x for them for new trial search methods, etc.

Thus this iterative procedure is quite ~ to R.

abs. gen. method, ~~and R. - abs. and comb. rules, etc.~~
 and is closely related to it.

- a) Movie : Margret O'Brien, B. Karloff, ~~XXXXX~~
 categories: M. O'Brien : 60% of time.
 B. Karloff : 80% of time.
 Both — Zero sample.

First names of main actors M and B : 60% of time ($\equiv 40\%$ for all movies)

- b) Physical laws : e.g. 1st law of thermo.

category of all known situations in which relevant data taken and law held

V.S. " " " " " " " " " " ~~XXXXXXXXXX~~

Q: Isn't the search problem extremely diff.? i.e. you have essentially reduced the undecidable prob. to a prob. that is just about as ~~easy~~ diff.?

~~Ans: The search prob. is as diff. as the gen. prob. of proving math theorems (No this will cause confusion, because the math prob. is formally unsolvable!)~~

A: This prob. is diff. However, it can be solved if one knows how to generate new ~~search~~ promising new search methods from old ~~one~~ search methods that have been known to be successful. In ~~the~~ ~~new~~ analyzing the abs. gen. prob., I believe that I have also made much progress in this search method ~~gen.~~ problem.

V (3) (c)

ngmsts.

i ntpst $\rightarrow$ ngmst.

ii $\delta \equiv \frac{\alpha}{\beta, \gamma}$ means $\beta \cdot \delta \cdot \gamma \subset \alpha$.

Slide #9

iii $\alpha \cdot \beta$

iv $\alpha \cap \beta$

"active" to "passive" xfm is done

(d) Examples of how "and" and how "and" combination is done.

i Passive:

$NP_1 \cdot Aux \cdot Verb \cdot NP_2 \rightarrow NP_2 \cdot Aux \cdot been \cdot Verb \cdot by \cdot NP_1$

Slide #10

(4,2,5,3,6,1) $\times$ $[V_4 \cap (NP_1 \cdot Aux \cdot Verb \cdot NP_2) \cdot been \cdot by]$ $\rightarrow$

$NP_2 \cdot Aux \cdot been \cdot Verb \cdot by \cdot NP_1$
4 2 5 3 6 1

Slide #11

ii "and" xfm:

$W \alpha_i Z, W \alpha_i Z \rightarrow W \alpha_i \text{ and } \alpha_i Z$

(1,2,4,5,3) $\times$ $[V_3 \cap (R \cdot \alpha_i \cdot R) \cdot \text{and} \cdot \alpha_i]$ $\rightarrow$ $W \alpha_i \text{ and } \alpha_i Z$
1 2 3 4 5 1 2 4 5 3

VI MT (1) PSL MTM

(a) Def. of a "Corpus" ~~is~~ of a Lang.

$\equiv$ set of all as's.

(b) Gn. L_1 and L_2 - define Corpus of L_3 .

(c) L_3 may be a PSL.

~~IF L_3 is a PSL it is solvable by ngmsts and permissible substitutions.~~

1. Example of its ~~initial~~ initial ngm. and permissible substitutions:

Slide #12

$S: \begin{matrix} S \\ 1 \\ S \end{matrix} \quad F: \begin{matrix} S \\ 1 \\ S \end{matrix} \rightarrow \begin{matrix} A & B \\ & \nearrow \\ B & A \end{matrix}$

$\begin{matrix} A & B \\ & \nearrow \\ A & \end{matrix} \rightarrow \begin{matrix} C & D \\ & \nearrow \\ C & D \end{matrix}$

$S \rightarrow \begin{matrix} A & B \\ & \nearrow \\ B & A \end{matrix} \rightarrow \begin{matrix} C & D & B \\ & \nearrow & \nearrow \\ B & C & D \end{matrix}$ $\leftarrow$ phrase in L_1
 $\leftarrow$ phrase in L_2

(d) If L_3 is a PSL it is solvable by ngmsts.

i. Some ngms: a, b or $a \cdot c; b$
ii. 4/combination rules for a, b and c, d -
 $a \cdot c, b \cdot d; a \cdot c, d \cdot b; c \cdot a, b \cdot d; c \cdot a, d \cdot b$.

Slide #13

V My own approach to the Grammar Recog. problem.

① Soln. of PSL and FSL by ngmsts.

② Def. of ngm. example: [a b b b . , or a , or b c ,

③ ~~Ngmst~~ Def. of ngmst. examples:

[a , a b c , a b , a m , b could be an ngmst.

set of all Noun phrases, etc. , set of all ~~make~~ sing. noun phrases,
set of all verb phrases, etc.

④ Creation by ~~the complete definition~~ definition of complete context.

e.g. The boy ~~x~~ the toy. : All ngms (= words or phrases)
that x could legally be.

or Y saw the toy : similarly for ngmst generated
by Y.

⑤ creation by concat. of ~~prev.~~ prev. defined ngmsts.

slide #5 e.g. $\alpha \cdot \beta$.
 $\alpha \equiv [\text{the, a}]$
 $\beta \equiv [\text{Boy, toy, } \text{~~man~~}]$

$\alpha \cdot \beta = [\text{the Boy, the toy, a boy, a toy.}]$

⑥ Discovery of identity of various ngmsts, defined in different ways.
e.g. x_i Boy saw the toy. & $[x_i] \equiv \alpha$
the y_j saw the toy $[y_j] \equiv \beta$.

slide #6

z_k saw the toy $[z_k] \equiv \gamma$

then $\gamma \subset \alpha \cdot \beta$ is a "discovered" relationship.

⑦ ~~Wang~~ Poss. to generate all membs. of all ngmsts from
knowledge of
i. ~~comb. rules~~ comb. rules betw. ngmsts. $\rightarrow$ which ngmsts are included in which others
ii. ~~initial~~ a few membs. of certain ngmsts.

↑ #3

↓ #4

② PSL with context dependent subs. ~~non-probably~~ ^{int.} cannot
be done with 2 above xforms only. $\cap$ may be suff. - or
others may be nec.

③ XL : Several new abs. and xform types needed.

② Ntpsts i all ngmsts are ntpsts.

ii $(\alpha, \beta, \gamma \dots)$ by cart. product of ngmsts w/o ntpsts.

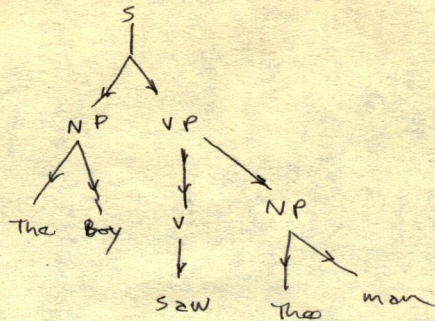
slide #7

iii $\forall k$ [Th. set of all k-tuples $\rightarrow$ when concat, an as result]

iv $\cap$ ~~intersection~~

slide #8 ③ str. $(1, 2, 1, 1) \times (a, b, c) = (a, b, a, a)$ } aside on
 $(2, 1, 3) \times (a, b, b) = (b, a, b)$

Slide # 2 (cont)



③ can generate infinitely long sentences: -

eg. Slide # 3

$\Sigma: a$

$F: a \rightarrow bab.$

$aBc \rightarrow aCDc$

$a, bab, bbabb, bbbabbb$ etc.

cannot

This lang. cannot be gen. by ~~FSG~~ FSG.

④ Context dependant substitutions (see slide # 3 $\uparrow$)

- ③ XL
- ② starts with "kernel" sentences ~~that~~ (usually generated by PSL)
 - ③ Perform xforms on ~~the~~ kernel sentences to get new ass
 - ④ " " " new ass's to get " "

④ Examples: Slide #4

1. $\{ NP_1 - Aux - Verb - NP_2 \} \rightarrow NP_2 - Aux - been - Verb - by - NP_1$
 { John has eaten the pie $\rightarrow$ The pie has been eaten by John

2. $\{ Z - X - W ; Z - Y - W \} \rightarrow Z - \frac{X}{Y} \text{ and } Y \frac{X}{Y} W$
 { John came to school today ; John ate breakfast today $\rightarrow$
 John ate breakfast and came to school today.

④ Pattern Conception (N. Chomsky and ~~the~~ G.A. Miller).

② Def. of Problem: To find Grammar rules for lang. - z forms

- i) large set of ass - to find rules.
- ii) ~~Allowed~~ Allowed to ask ~~various~~ "teacher" if a certain s is an as.
- iii) Usually mixture of i and ii used.

③ ~~the~~ Soln. of FSL gn.

- i) Not obviously generalizable to PSL or XL.

3:02

3:04

2:32 The Mech. of Ling. Learning. Namur Paper: Outlines

I What is ind. Inf.?

- ① ~~From~~ General Rule from many isolated cases.
- ② Same as problem of prediction [e.g. weather]
- ③ Pattern completion.

II My previous approach and direction of work.

- ① Use of categories for prediction e.g. Cloudy day $\rightarrow$ rain.
- ② Good categories $\rightarrow$ good predictions.
- ③ Prob. of deriving ~~cat~~ good categories.

start with primordial abs - build up cats and new abs. progressively.

④ ~~Assigning~~ Assigning U's to cats..

⑤ Hier order abs - how U's assigned to them.

⑥ Continuing process of producing New abs. from Old, and Ueval $\leftarrow$ U and U together give final U.



④ ~~Problem of~~ Useful abs, and abs x fms

⑤ Problem of Ueval.

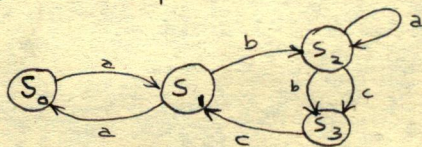
III Previous applic. to arith.

- ① Some Reasonable success with ~~tax~~ simple arith learning, using very simple abs, and x fms.

292 IV Chomsky's work.

① FSL : ② Generated by Finite State Machine.

③ Example : Slide #1



permissible sequences! $\rightarrow a a$
states $\rightarrow S_0 S_1 S_0$

$\rightarrow a b a a c c a$
 $S_0 S_1 S_2 S_2 S_2 S_3 S_1 S_0$

④ Chom. showed that English is not a FSL.

- ② PSL ② Consists of phrases that have been concat. into sent.
- th. phrases in turn may be concat. of other phrases, etc.
- ③ can be gen. by substitution.

Example : Slide #2 :

~~namur~~ Σ : S

S
↓
NP · VP
The · N · VP
The N · V · NP
The N · V · The N
The Boy saw The N
The Boy saw The Man

F: $S \rightarrow NP \cdot VP$

$NP \rightarrow \text{The} \cdot N$

$N \rightarrow \text{Man, Toy, Boy, Airplane}$

$VP \rightarrow V \cdot NP$

$V \rightarrow \text{saw, sees, is, was} \dots$

List of topics of interest.
Use this as outline of SF paper.

Notes for talk to MT Group at MIT ^{Tues} Aug 19, 1968 (1)
Chomsky out of town, however!

How to solve PSL's

~~How to solve PSL's~~

- (a) Most general way, using $\leq 2^{N^2}$ classes $\approx (2^N)^N \Rightarrow N^N > N!$
and 1 digit mult table.
- (b) Using only classes of terminal seqs. $2 \times 2^N = 2^{N+1}$ classes needed
 $2^{N+1} \ll N! \approx N^N$. If there are, at most, 3 poss. state endings for each seq.
then the max. no. of equiv. classes is $\approx N^3$.

2) Ngmst method for PSL's.

(a) Ngm may be word or seq. of words

(b) Ideally Ngmsts corresp. to "development" of an element

in PSL. $F: X_i \rightarrow Y_i$

(c) Give example of how "multiplication" rules are discovered.

e.g.

$a \quad a b a \quad b a b b$

$\Sigma: a$

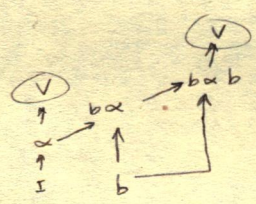
$F: a \rightarrow b a b$

$\equiv \alpha$

if $F: a \rightarrow bc$
or $b \rightarrow de$
 $c \rightarrow af$
Then $ngmst_a = ngmst_b \cdot ngmst_c$.

Then $b \alpha b = \alpha$.

or



(d) $F: a b c \rightarrow a A B c$ not done in detail —

(e) Th. Search prob.
The "index tabs" or Λ may be probably used. See 847.10-22 for how Λ can sort. (also Λ is easy).

3) MT for PSL's.

(a) $L_1, L_2 \rightarrow L_3$ How L_3 's "corpus" consists of sentence pairs.

(b) How L_3 is a PSL: What Σ is. ^{its} $\{ \text{see 843.30} \}$
What its F is.

(c) How to get trial what $\mathbb{F}$ ngmsts look like
① A_i, B_i with $\pm$ comb rules for pairs of ngm (rather than 2)

② A_i, B_i

(d) How ngmsts are searched for: 844.37. FF

4) XL's.

(2) Th. how operating ~~na~~ and abs. needed: 886 - 888

(b) Some examples: 889 - 890

NP-AUX-Verb-NP₂ →
John has eaten the pie
NP₂ Aux be~~an~~ Verb by NP₁
~~John has eaten the pie.~~
The pie has been eaten by John.

5) XL MTTM.

(2) Use of abs. pairs. i.e. a ngr may be paired with an str.

6) On How getting TM to produce a "true" sentences is a special kind of "Gram. discov." prob.

That this skill will be needed for medium level MT -
i.e. simple ambiguity resolutions

4) (c)  V
all known words, are ngrmsts.

$\frac{\beta}{\alpha,}$ or $\frac{\beta}{, \alpha}$ [$\frac{V}{\alpha,}$ and $\frac{V}{, \alpha}$ are commonest]

$\alpha \cdot \beta$ (concat.)

$\alpha \cap \beta$ (int.)

~~Str~~ Str x Ntpst.

Note change of order

~~Str~~

Ntpst {

(1) every ngrmst.

(2) $(\alpha, \beta, \gamma \dots)$ is an equal ntpst ($\equiv \bar{x}$).

(3) $\cap$ of various ntpsts of = n : e.g. $(\alpha, \beta) \cap (\gamma, \delta)$.

(4) "dividing" V by ntpst. - gives 1 ntpst for each

Value of n. - Show how it is used to get $\frac{V}{\alpha,}$, $\frac{V}{, \alpha}$.

(5) Strs {

(1) permutation a/o ~~re~~ repetition a/o omission.

- (b) Solved for some PSC pairs - ~~Modifies~~ ~~Rearrange~~
- Rearranges sentence order, completely
 - Interp. of word in certain kinds of context.
 - General incomplete state of work.

(2) "Machine language" approach:

(a) Simplified English $\rightarrow$ machine orders

(b) Machine orders $\rightarrow$ Simplified Eng.

(c) Advantages - machine orders are operational meanings

- is $\therefore$ ~~idea~~ similar to human learning of 2 aspects of lang.

i. How speech sound tells about world.

ii. " talking may effect world.

Makes ~~state~~ ~~to~~ $P \rightarrow P \times / \text{th.}$ possl.

VII Gen. Conclusions:

~~(a)~~ (a) Goal was finding abss. and xforms useful in many fields

(b) Present abss and xforms seem ~~to~~ useful in both
arith, and linguistic Learning.

Actually Given Feb 10, 60

at . Cal. Tech.

- Feb 10, 60 (00) why ask? - "How all learning can be simulated by machine." Other trivial models
- Recordery: What is prob.?
- 1) Parsimony (exact statement)
 - 2) Simplest eq. [Don't give rigorous defn. of logic yet]
 - 3) $\leq$ method.
 - 4) Gives same results for ∞ samples.
 " Some new results, quantitative. (curve fitting)
 " " " quant. descr. of unrepresentative
ideas on hypoth. formation, etc.
 - 5) Machine defn. of learn / input seqs. and "long" - Corpus defines Grammar.
 - 6) Indip. of prob on nature of Machine
 - 7) "World view." (not complete adequacy of model).
 - 8) Discuss. of operators (a) R α β a b k
(b) Curve fitting.
(c) Gives same results for contin. of exp. data.
 - 9) Physical realization (a) By random and trials
↑ diff.
(b) In hill-climbing } How different from
Friedberg's simulation.
 - 10) Mention Operators
 - 11) Actually Creative ↑ ??

- Exp
- 7) Equivalent non-min. coding method
 a) Example. R ~~α β~~ α β a b k.
 b) curve fitting.

~~(c) Operator analysis~~

~~World View~~

- 8) Physical realization
 a) direct - random trials of terminal bits.
 b) Hill climbing on ops.