

Notes on Inference Devices

Santa Fe Institute

Edward G. Huang

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1 Notation and Definitions

Standard notation is taken from set theory and vector algebra. We clarify some notation specific to computation and inference devices.

Computation and Turing Machines

- \mathbb{B}^* The space of all finite bit strings.
- Λ Symbol alphabet of a Turing Machine.
- σ A symbol on a Turing Machine tape.
- Q Set of finite states of a Turing Machine.
- Δ Transition function of a Turing Machine.
- k Number of tapes of a Machine.
- η Non-halting state of a Turing Machine.

Deterministic Inference Devices

- U Set of possible histories of the universe.
- u A history of the universe in U .
- X Setup function of an ID that maps $U \rightarrow X(U)$. A binary question concerning $\Gamma(u)$.
- x A binary question and a member of image $X(U)$.
- Y Conclusion function of an ID that maps $U \rightarrow \{-1, 1\}$. A binary answer of an ID for $X(u) = x$.
- y A single-valued answer, and member of image $Y(U) = \{0, 1\}$.
- Γ A function of the actual values of a physical variable over U , equivalent to $\Gamma(u) = S(t_i)(u)$.
- γ Possible value of a physical variable, a member of the image $\Gamma(U)$.
- δ Probe of any variable V parameterized by $v \in V$ such that :

$$\delta_v(v') = \begin{cases} 1 & \text{if } v = v' \\ -1 & \text{otherwise} \end{cases}$$

- \wp Set of probes over $\Gamma(U)$.

$\mathcal{D} = (X, Y)$ An inference device, consisting of functions X and Y .

\bar{F} Inverse. Given a function F over U , $F^{-1} = \bar{F} \equiv \{\{u : F(u) = f\} : f \in F(U)\}$.

> Weak inference: a device \mathcal{D} weakly infers Γ iff $\forall \gamma \in \Gamma(U), \exists x \in X(U)$ s.t. $\forall u \in U$,
 $X(u) = x \implies Y(u) = \delta_\gamma(\Gamma(u))$.

>> Strong inference: a device (X, Y) strongly infers a functions (S, T) over U iff $\forall \delta \in \wp(T)$
and all $s \in S(U)$, $\exists x$ such that $X(u) = x \implies S(u) = s, Y(u) = \delta(T(u))$.

2 Turing Machines

Arora and Barak denote a Turing Machine (TM) as $T = (\Lambda, Q, \Delta)$ containing:

1. An *alphabet* Λ of a finite set of symbols that T 's tapes can contain. We assume that Λ contains a special blank symbol B , start symbol S , and the numbers 0 and 1.
2. A finite set Q of possible states that T 's register can be in. We assume that Q contains a special start state q_s and a special halt state q_h .
3. A transition function function $\Delta : Q \times \Lambda^k \rightarrow Q \times \Lambda^{k-1} \times \{L, S, R\}^k$, where $k \geq 2$, describing the rules T use in performing each step. The set $\{L, S, R\}$ denote the actions *Left*, *Stay*, and *Right*, respectively.

Suppose T is in state $q \in Q$ and $(\sigma_1, \sigma_2, \dots, \sigma_k)$ are the symbols on the k tapes. Then $\Delta(q, (\sigma_1, \dots, \sigma_k)) = (q', (\sigma'_2, \dots, \sigma'_k), z)$ where $z \in \{L, S, R\}^k$ and at the next step the σ symbols in the last $k - 1$ tapes will be replaced by the σ' symbols, the machine will be in state q , and the k heads will move *Left*, *Right* or *Stay*. This is illustrated in Figure 1.

Figure 2.1. The transition function Δ for a k -tape Turing Machine

$(q, (\sigma_1, \dots, \sigma_k))$				$(q', (\sigma'_2, \dots, \sigma'_k), z)$				
Input symbol	Work/output symbol read	...	Current state	New work/output tape symbol	...	Move work/output tape	...	New state
\vdots	\vdots	\ddots	\vdots	\vdots	\ddots	\vdots	\ddots	\vdots
σ_1	σ_i	\ddots	q	σ'_i	\ddots	z_i	\ddots	q'
\vdots	\vdots	\ddots	\vdots	\vdots	\ddots	\vdots	\ddots	\vdots

Remark: Λ can be reduced to $\mathbb{B} = \{0, 1\}$ and k can be reduced to 1 without loss of computational power. Then, any Turing Machine can be expressed as a partial recursive function mapping $\mathbb{B}^* \rightarrow \mathbb{B}^* \cup \eta$, where η is the undefined non-halting output. Since $|\mathbb{B}^* \times \mathbb{B}^* \cup \eta| = |\mathbb{N} \times \mathbb{N}| = |\mathbb{N}|$, the set of all Turing Machines is countably infinite.

3 Inference of Turing Machines

In the next two examples we examine strong inference of simple single-valued functions.

Example 3.1 Let $T(U) = \{0, 1\}$ and $S(U) = \{0, 1, 2\}$. We construct (X, Y) in the table at the left such that it strongly infers (S, T) . The right table indicates x for each s, δ such that the definition of strong inference is satisfied:

u	$X(u)$	$Y(u)$	$S(u)$	$T(u)$	
1	1	1	0	0	
2	2	-1	0	0	
3	3	1	1	0	
4	4	-1	1	0	
5	5	1	2	1	
6	6	-1	2	1	

(s, δ)	δ_0	δ_1
0	1	2
1	3	4
2	6	5

Example 3.2 Let $T(U) = \{1, 2, 3\}$ and $S(U) = \{1, 2, 3, 4, 5\}$. Again, we construct (X, Y) in the table at the left such that it strongly infers (S, T) . The right table indicates x for each s, δ such that the definition of strong inference is satisfied:

u	$X(u)$	$Y(u)$	$S(u)$	$T(u)$	
1	1	1	1	1	
2	2	-1	2	1	
3	3	-1	3	2	
4	4	-1	4	2	
5	5	-1	5	3	
6	6	1	2	1	
7	7	-1	1	1	
8	8	1	3	2	
9	9	1	4	2	
10	10	1	5	3	

(s, δ)	δ_1	δ_1	δ_1	δ_1	δ_1
1	1	7	7	7	7
2	6	2	2	2	2
3	3	8	3	3	3
4	4	9	4	4	4
5	5	5	10	5	5

Theorem *Any deterministic Turing Machine can be strongly inferred by a device iff*

$$\forall s \in S(U), |S^{-1}(s)| \geq 2.$$

Proof Let $U := \mathbb{N}$. Define $S : U \rightarrow \mathbb{B}^*$ to be a function that maps integers to binary bit strings and $T : U \rightarrow \mathbb{B}^* \cup \eta$ as a function that maps u to the space of bits strings union with the non-halting output η . Define $V = \{u : S^{-1}(s)\}$ for some value of s .

Assume the function $f : S \rightarrow T$ given by $f(s) = T(S^{-1}(s))$ is single-valued. Set $Y(v_1) = 1$ and $Y(v_2) = -1$. Then for each pair $(s, \delta_{t \in T(U)})$ choose $X(v_1) = x_1$ if $t = T(v_1)$ or otherwise choose $X(v_2) = x_2$. Since the choice of s was arbitrary, this holds for all (s, δ_t) pairs.

Now suppose that $|V| < 2$ for some s . If $V = \emptyset$ then there exists no x that can force $S = s$. If $|V| = 1$, then we can assign $Y(v) = y \in \{-1, 1\}$. However, whatever value we assign, we cannot guarantee that $\delta_t(T(v)) = Y(v)$ for all t since $|T(U)| \geq 1$. \square

4 Inference Complexity

Definition Let \mathcal{D} be an inference device and Γ be a function over U where $X(U)$ and $\Gamma(U)$ are countable and $\mathcal{D} > \Gamma$. Let the **size** of $\gamma \in \Gamma(U)$ be written as $\mathcal{M}_{\mu:\Gamma(\gamma)} = -\ln[\int_{\Gamma^{-1}(\gamma)} d\mu(u)1]$. Then the **inference complexity** of Γ with respect to \mathcal{D} and measure μ is defined as:

$$\mathcal{C}_{\mu}(\Gamma; \mathcal{D}) \triangleq \sum_{\delta \in \wp(\Gamma)} \min_{x: X=x \Rightarrow Y=\delta(\Gamma)} [\mathcal{M}_{\mu, X}(x)]$$

Remark: This is only a working definition and may be revised depending on its behavior.