Entropy and Speed of Turing machines

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Turing machines with one head and one tape.

- States Q.
- Symbols Σ.
- Transition map: $Q \times \Sigma \rightarrow Q \times \Sigma \times \{-1, 1\}$

Turing machines as a dynamical system: $M : Q \times \Sigma^{\mathbb{Z}} \to Q \times \Sigma^{\mathbb{Z}}$ (the tape moves, not the head)

- No specified initial state (very important)
- No specified initial configuration (crucial)
- Might have final states (anecdotal)

Seeing Turing machines as a dynamical system changes a lot of things:

- Interested in the behaviour starting from *all* configurations, not only *one* configuration.
- Hard to conceive of a TM with no (temporally) periodic configurations.
- Nevertheless, intricate TMs do exist.

Theorem (essentially Turing 1937)

There is no algorithm to decide whether a TM does not halt on its input configuration.

Theorem (Hooper 1966)

There is no algorithm to decide whether a TM does not halt on some input configuration.

simplified proof by Kari-Ollinger (2008), which leads to the undecidability of the existence of a periodic point.

Part of a recent trend which sees computational models as dynamical systems.

Good alternative to the classical Robinson technique for tilings:

- Turing machines (as a Dyn. Sys.) can be easily encoded into piecewise affine maps.
- Piecewise affine maps can be easily encoded into tilings

We will show why some thing are actually computable for 1-tape Turing machines, namely:

- its speed
- its entropy

For *c* a configuration, let $S_n(c)$ be the set of (different) cells visited during the first *n* steps of the computation on input *c*, and $s_n(c) = \#S_n(c)$

 $s_n(c)$ is (Kingman)-subadditive

$$s_{n+m}(c) \leq s_n(c) + s_m(M^n(c))$$

If $d(x, y) \le 2^{-s_n(x)}$ then $d(M^n(x), M^n(y)) \le 1/2$.

$$\overline{s}(c) = \limsup \frac{s_n(c)}{n}$$
 $\underline{s}(c) = \liminf \frac{s_n(c)}{n}$

If $\liminf = \limsup$, we denote by s(c) the *speed* of *c*.







Definition

$$S(M) = \max_{c \in \mathcal{C}} \underline{s}(c) = \max_{c \in \mathcal{C}} \overline{s}(c) = \limsup_{n} \sup_{c} \frac{s_n(c)}{n} = \inf_{n} \sup_{c} \frac{s_n(c)}{n}$$

All definitions are indeed equivalent. This is due to compactness of the set of configurations and subadditivity. Note that it is a maximum, not a supremum.

Here is an equivalent definition, from Oprocha(2006).

For *c* a configuration, let T(c) be the *trace* of the configuration, i.e. the sequence (states, symbols) visited by the machine. Let T be the set of all traces

Definition (Oprocha (2006))

$$H(M) = H(\mathcal{T}) = \lim \frac{1}{n} \log |T_n|$$

where T_n are all possible words of length *n* of the trace

Note: The machine in the example has zero entropy (any word of T_n has "few" symbols *b*)

Theorem

Entropy and speed are computable for one-tape Turing machines. That is, there is an algorithm, that given every ϵ , can compute an approximation upto ϵ .

Furthermore, the speed is always a rational number

Plan of the talk

- Link between entropy and speed
- Some technical lemmas
- Graphs

- Surprising, usually every dynamical quantity is semi-computable but not computable
- The speed is not computable as a rational number.
 - Starting from *M*, we can effectively produce a TM *M'* for which $S(M') \sim 2^{-t}$ where *t* is the number of steps before *M* halts on empty input.
- There is no algorithm to decide if the entropy is zero.
- None of the techniques work with multi-tape TM. The entropy is not computable anymore.









Entropy = Complexity

- Kolmogorov complexity K(x) of a word x is the size of the smallest program that outputs x
- The (average) complexity of a infinite word *u* is

$$\overline{K}(u) = \limsup rac{K(u_{1...n})}{n}$$

(same with $\underline{K}(u)$)

Theorem (Brudno 1983, see also Simpson 2013)

For a subshift \mathcal{T} ,

$$h(\mathcal{T}) = \max_{u \in \mathcal{T}} \overline{K}(u) = \max_{u \in \mathcal{T}} \underline{K}(u)$$

(More exactly, the maximum is reached $\mu\text{-a.e.}$ for μ ergodic of maximal entropy)

Proofs for entropy and speed are relatively the same. We will deal with speed in the talk.

Entropy vs Speed





$$S(M) = \max_{c \in C} s(c) = \inf_{n} \sup_{c} \frac{s_n(c)}{n}$$

S(M) (and H(M)) is computable from above due to the last definition. We need to prove it is computable from below.

We need lower bounds on the speed and the entropy.

$T(c) = (q_1, a)(q_2, b)(q_1, c)(q_1, a)(q_3, a)(q_1, c)(q_3, c)(q_1, a)(q_2, c)(q_3, b).$

 $0 \frac{1}{T(c)} = (q_1, a)(q_2, b)(q_1, c)(q_1, a)(q_3, a)(q_1, c)(q_3, c)(q_1, a)(q_2, c)(q_3, b).$

0 1 2 1 2 3 2 1 2 3 $T(c) = (q_1, a)(q_2, b)(q_1, c)(q_1, a)(q_3, a)(q_1, c)(q_3, c)(q_1, a)(q_2, c)(q_3, b)...$ $T(c) = (q_1, a)(q_2, b)(q_1, c)(q_1, \circ)(q_3, \circ)(q_1, c)(q_3, \circ)(q_1, \circ)(q_2, \circ)(q_3, \circ)...$

Deleted information can be recovered (no loss in Kolmogorov complexity)

 $T'(c) = aq_1bq_2q_1q_2q_3q_1cq_3q_1q_2cq_3$

 $T'(c) = aq_1 bq_2 q_1 q_2 q_3 q_1 cq_3 q_1 q_2 cq_3$ $T'(c) = aq_1 bq_2 q_1 q_2 q_3 q_1 cq_3 q_1 q_2 cq_3$

In the rest of the talk, states will be colored

- T'(c) is well defined when c matters.
- The speed on *c* is the average number of boxed symbols.
- The complexity of *c* is the average of the complexity of T'(c).
- The speed and the complexity are easier to compute using T'.

If *c* is of maximum speed/entropy, then *M* will visit each cell finitely many times.

If the TM zigzags on input *c*, then it is losing time.

Corollary

T'(c) is well defined.

Let *c* of maximum speed/entropy.

Let f_n be the first time we visit cell n, and I_n the last time we visit cell n. Then $f_n \sim I_n$

Corollary

The speed on *c* is the average number of boxed symbols.

The position p_n where the *n*-th boxed symbol appear satisfy $f_n \le p_n \le I_n$

Entropy vs Speed





Now we explain why this T' helps.

Let *S* be the subshift generated by all T'(c).

- Points in S that are not of the form T'(c) have smaller speed/entropy.
- S can be described explicitely.

We define L and R inductively

 $(cR\epsilon, \epsilon, a) \in L$

If by reading *a* from state q, we write *b*, go right in state q'

 $(\mathbf{qw},\mathbf{q'w'},\mathbf{a})\in L\iff (\mathbf{w},\mathbf{w'},\mathbf{b})\in R$

If by reading *a* from state q, we write *b*, go left in state q'

$$(qq'w,w',a) \in L \iff (w,w',b) \in L$$

(Similar definition for R). Now S is the set of all words where all factors of the form awbw'c satisfy $(w, b, w') \in L$ States are synchronizing (magic) words. If *xawc* and *dwby* are valid, then *xawby* is valid.

In some way, *S* can be seen as the set of paths over an infinite graph (where states represent vertices).

For a word *c*, denote by s(c) its average number of boxed symbol, and K(c) its average complexity.

Let S_n be the subshift of S that forbids more than n consecutive states. Then

$$S(M) = \sup_{c \in S} s(c) = \sup_{n} \sup_{c \in S_n} s(c)$$
$$H(M) = \sup_{c \in S} K(c) = \sup_{n} \sup_{c \in S_n} K(c)$$

Let *c* that achieves the maximum $s(c) = \alpha > 0$ and *n* big enough

- *c* may contain more than *n* consecutive states, but this should not happen so often
- Use the cut and paste property to replace these parts by some with a smaller number of consecutive states

If done properly, this will not decrease the speed, and only slightly decrease the complexity.

$$S(M) = \sup_{c \in S} s(c) = \sup_{n} \sup_{c \in S_n} s(c)$$
$$H(M) = \sup_{c \in S} K(c) = \sup_{n} \sup_{c \in S_n} K(c) = \sup_{n} H(S_n)$$

 S_n is a computable sequence of subshifts of finite type, so we can compute an increasing sequence of reals that converges to H(M). We can say better for the speed

The speed is a rational number, and is achieved for some S_n by a periodic configuration

In each S_n , the maximum number of boxed symbols is achieved for a periodic configuration c_n . Let W be the set of states that appear in c_n .

- Each $w \in W$ appears only once in the period of c_n .
- If |*W*| is too big, there will be many big words in *W*, so the speed will be too small.
- Hence |W| contains at most *b* words for some *b*.
- If one of them is bigger than c, then the speed is at most $\frac{b}{c-b}$ hence c is also bounded.

Characterize entropies of one-tape Turing machines.

The numbers are computable, and it cannot be all computable numbers.

Find how to compute the average speed.

Find a Turing machine with two tapes for which the entropy (resp. speed) is not a computable number.