### Komolgorov Complexity

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# Outline

- Minimal Description Length
- Inequalities
- Optimality
- Incompressible Strings

### Information

- Today we would like to define a notion of how much information a string contains.
- This is also related to how random a string is.
- This area is useful in the development of pseudo-random number generators which can be used in randomized algorithms and in cryptography.

# Descriptions via TMs

- Although it is quite long it is not very random.
- I can quite simply describe it as write hundred and twenty five 1's in a row.
- One can make a TM *M* which reads its input in binary then writes out that many 1's.
- If I had a million 1's. Then *<M*, 1000000> would easily be shorter to write down then all these 1's.
- This motivates the next definition.

#### Minimal Description Length

- **Definition.** Let *x* be a binary string. The minimal description of *x*, d(x), is the lexicographical first shortest string  $\langle M, w \rangle$  such that *M* on input *w* halts with x on the tape. We define K(x) = |d(x)|. **Theorem.**  $\exists c \forall x [K(x) \leq |x| + c]$ .
- **Proof.** Let *M* be the machine that halts as soon as it starts. Then  $\langle M, x \rangle$  describes the string *x*. The length of |M| is some number *c*. From which we get that  $K(x) \leq |\langle M, x \rangle| \leq |x| + c$  as desired.

# Some Inequalities Involving Minimal Description Length

**Theorem.**  $\exists c \forall x [K(xx) \leq K(x) + c].$ 

- **Proof.** Let  $d(x) = \langle M, w \rangle$  be a minimal description of *x*. Then  $\langle N, \langle M, w \rangle \rangle$  describes *xx*, where *N* is the machine which on input  $\langle M, w \rangle$  runs *M* on *w*, then write the output of the simulation twice.
- Using the same kind of idea one can show: **Theorem.**  $\exists c \forall x, y [K(xy) \le 2K(x) + K(y) + c].$

# Optimality of the Definition

- Our definition is in terms of TMs, would it have made a difference to define minimal description length in terms of C++ programs?
- Let  $K_p(x)$  be defined the same as K(x) but using the description language p.

**Theorem.**  $\forall x [K(x) \le K_p(x) + c].$ 

**Proof.** Consider the machine M which on input *w* simulates the programming language *p* on input *w*, then outputs what that programming language would output. So  $\langle M, d_p(x) \rangle$  outputs *x* and this string is at most constantly longer than  $K_p(x)$ .

### Incompressible Strings

**Definition.** Let x be a string. Say that x is *c*-compressible if  $K(x) \le |x| - c$ .

If x is not c-compressible, we say that it is **incompressible by c**.

If *x* is not *1*-compressible, we say that it is **incompressible**.

Theorem. Incompressible strings of every length exist.

**Proof.** The number of strings of length n is  $2^n$ . Each description is a binary string, so the number of descriptions of length less than n is at most the sum of the number of strings of each length up to n-1, or

 $1 + 2 + 4 + 8 + + 2^{n-1} = 2^n - 1$ 

which is less than the number of strings of length n. So some incompressible string of length n must exist.