### Randomness for Continuous Measures

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### **Motivation**

Joint work with Jan Reimann.

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For which sequences  $X \in 2^{\omega}$  do there exist (representations of) continuous probability measures  $\mu$  such that X is random for  $\mu$ ?

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### Example

Different measures give different notions of randomness. Student scores on a calculus exam do not produce a random sequence for the uniform probability distribution, but they do give a random sequence for an appropriately weighted distribution.

### Randomness

There is a detailed and robust theory characterizing effective randomness relative to Lebesgue measure. Equivalently:

- ▶ (Martin-Löf) X is random if and only if X does not belong to any effectively presented set of measure 0.
- ► (Kolmogorov et al) X is random if and only if all of its initial segments are effectively incompressible.

### Randomness

We will consider effective aspects of X's being random as applied to a variety of measures  $\mu$ .

#### Definition

 $\mu$  is continuous iff for every  $X \in 2^{\omega}$ ,  $\mu(\{X\}) = 0$ .

The cases of discontinuous and continuous measures are quite different.

### Notation

We will use finite binary sequences  $\sigma$  and subsets A of  $2^{\omega}$  to define open subsets of  $2^{\omega}$ :

$$[\sigma] = \{X : \sigma \text{ is an initial segment of } X\}$$

$$[A] = \{X : \exists \sigma \in A(X \in [\sigma])\}$$

## Representing Measures

Let  $\mu$  be a probability measure on  $2^{\omega}$ .

### **Definition**

A representation m of a probability measure  $\mu$  on  $2^{\omega}$  provides, for each  $\sigma \in 2^{<\omega}$ , a sequence of intervals with rational endpoints, each interval containing  $\mu([\sigma])$ , and with lengths converging monotonically to 0.

## Effective $\mu$ -Randomness

Let m represent  $\mu$ .

#### **Definition**

- 1. A Martin-Löf test for  $\mu$  relative to m is a sequence  $(A_n:n\geq 1)$  of subsets of  $2^{<\omega}$  such that  $(A_n:n\geq 1)$  is uniformly recursively enumerable relative to m and for each n,  $\mu([A_n])\leq 1/2^n$ .
- 2. For  $X \in 2^{\omega}$ , X is effectively  $\mu$ -random relative to m iff for every Martin-Löf test  $(A_n : n \ge 1)$  for  $\mu$  relative to m,  $X \notin \cap_{n \ge 1} [A_n]$ .

When m is understood, we will just speak of X's being  $\mu$  random.

## Higher Levels of Randomness

### **Definition**

 $X\in 2^\omega$  is n-random relative to a representation m of  $\mu$  if and only if X passes every Martin-Löf test relative to  $m^{(n-1)}$  (the (n-1)st Turing jump of m), in which the measures of the open sets of the test are evaluated using  $\mu$ .

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We now have the basic definitions in place.

### The Discontinuous Case

Now, we consider discontinuous probability measures. According to the previous definition, if  $\mu$  concentrates on X then X is  $\mu$ -random. However, this only occurs trivially.

### Proposition

If  $\mu(\{X\}) > 0$ , then X is recursive relative to any representation of  $\mu$ .

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If  $\mu(X) > 0$ , then X is recursive relative to any representation of  $\mu$ .

### Question

When is  $X \in 2^{\omega}$  random relative to some  $\mu$  for which X is not an atom?

## General Measures

#### Theorem

For  $X \in 2^{\omega}$ , the following conditions are equivalent.

- 1. There is a probability measure  $\mu$  on  $2^{\omega}$  such that X is not a  $\mu$ -atom and X is random relative to  $\mu$ .
- 2. X is not recursive.

### General Measures

*Positive.* The only way to avoid being recursive is to have random content.

*Negative.* Relative recursive randomness can only distinguish between recursive and not recursive.

Fix X to be not recursive. In the next few frames, we will sketch the main ingredients of the construction of the measure  $\mu$  from X.

### Posner and Robinson

### Theorem (Posner and Robinson)

For any nonrecursive X, there is a G such that  $X + G \equiv_T G'$ .

Fix G so that, relative to G, X has the same Turing degree as the Turing jump of G.

### Kučera

## Theorem (Kučera)

There is a 1-random set R such that  $R \equiv_T 0'$ .

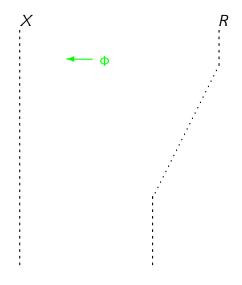
Kučera's proof relativizes.

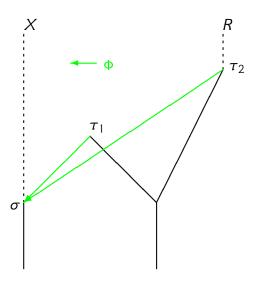
Relative to G, X has the same Turing degree as a random real R.

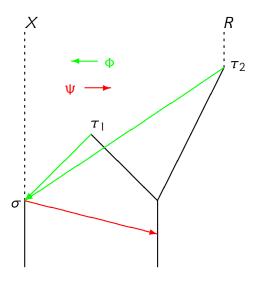
Let  $\Psi$  and  $\Phi$  be Turing functionals recursive relative to G such that  $\Phi(R) = X$  and  $\Psi(X) = R$ .

If  $\Phi$  were a homeomorphism with inverse  $\Psi$ , then there would be a measure  $\mu$  obtained by pulling back to Lebesgue measure using  $\Phi^{-1} = \Psi$ . R's being random would ensure X's being  $\mu$ -random.

We adapt this paradigm to the partial continuous  $\Phi$  and  $\Psi$ , which are inverses on X and R.







For  $\sigma\in 2^{<\omega}$ , let  $\mathit{Pre}(\sigma)$  be the set of minimal elements of  $\{ au: \Phi( au)=\sigma \text{ and } \Psi(\sigma)\subseteq au\}.$ 

When X extends  $\sigma$ ,  $Pre(\sigma)$  is a recursively enumerable antichain of possible initial segments of R. In the previous slide,  $\tau_1$  and  $\tau_2$  are elements of  $Pre(\sigma)$ .

Let  $\lambda$  denote Lebesgue measure. Consider the following consistency requirements  $\mathcal R$  on a measure  $\mu$ .

- 1.  $\mu([\sigma]) \ge \lambda([Pre(\sigma)])$ . Thus,  $\mu$  dominates the measure of pulling back  $\Phi$  on those strings for which  $\Psi(\Phi)$  is the identity.
- 2.  $\mu([\sigma]) \leq \lambda([\Psi(\sigma)])$ . Thus,  $\mu$  does not concentrate on reals in the domain of  $\Psi$ .

There is an infinite G-recursive, G-recursively-bounded tree T such that any infinite path in T is a rational representation m of a measure  $\mu$  satisfying  $\mathcal{R}$ .

## Lemma (Downey-Hirschfeldt-Miller-Nies, Reimann-Slaman)

Any infinite G-recursive, G-recursively-bounded tree has an infinite path m such that R is random relative to m.

Fix a path m in T such that R is random relative to m. X's failing an m-recursive Martin-Löf test relative to  $\mu$  would pull back to R's failing an m-recursive Martin-Löf test relative to  $\lambda$ , an impossibility.

Conclusion: X is  $\mu$ -random.

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### **Definition**

- ▶ For X, Y, and Z in  $2^{\omega}$ , we write  $X \equiv_{T,Z} Y$  to indicate that there are Turing reductions  $\Phi$  and  $\Psi$  which are recursive in Z such that  $\Phi(X) = Y$  and  $\Psi(Y) = X$ .
- ▶ When  $\Phi$  and  $\Psi$  are total, we write  $X \equiv_{tt,Z} Y$ .

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Turing reductions correspond to continuous functions defined on subsets of  $2^{\omega}$ . Truth-table (tt) reductions correspond to continuous functions defined on all of  $2^{\omega}$ .

degree theoretically characterizing relative randomness

### Proposition

For X and Z in  $2^{\omega}$ , the following conditions are equivalent.

▶ There is  $\alpha$  continuous measure  $\mu$  which is recursive in Z such that X is n-random for  $\mu$  and Z.

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- There is α continuous dyαdic measure μ which is recursive in Z such that X is n-random for μ and Z.

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- ▶ There is  $\alpha$  continuous dyadic measure  $\mu$  which is recursive in Z such that X is n-random for  $\mu$  and Z.
- ▶ There is an R such that R is n-random relative to Z and an order preserving homeomorphism  $f: 2^{\omega} \to 2^{\omega}$  such that f is recursive in Z and f(R) = X.

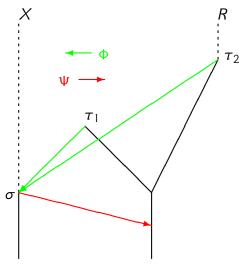
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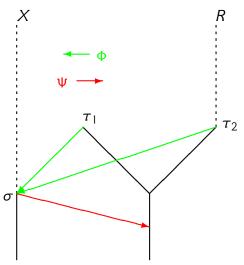
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- ► There is an R such that R is n-random relative to Z and  $X \equiv_{tt,Z} R$ .





When  $\Psi$  and  $\Phi$  are partial recursive,  $Pre(\sigma)$  is a recursively enumerable set.

 $X \equiv_{tt} R$ 



When  $\Psi$  and  $\Phi$  are total recursive,  $Pre(\sigma)$  is a recursive set as is the set  $\{\tau : \Psi(\Phi(\tau)) \not\subseteq \tau\}$ . The former contributes to  $\mu(\sigma)$  and the latter can be distributed as it appears. Since  $\Psi$  is total,  $\mu$  is continuous.

### Recursive Closed Sets

#### **Definition**

For T is a recursive subtree of  $2^{<\omega}$ , then the set P of infinite paths through T is a  $\Pi_1^0$ -class.

## Theorem (Well-known)

Suppose that R is 1-random, P is a  $\Pi_1^0$ -class, and  $R \in P$ . Then  $\lambda(P) > 0$ .

## Failures of Continuous Randomness

## Theorem (Kjos-Hanssen and Montalbán)

Suppose that P is a countable  $\Pi_1^0$ -class and  $X \in P$ . Then there is no continuous  $\mu$  such that X is  $1-\mu$ -random.

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### **Definition**

 $X \in NCR_k$  if and only if there is no representation m of a continuous measure  $\mu$  such that X is k-random relative to the representation m of  $\mu$ .

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By Kjos-Hanssen and Montalbán, every element of a countable  $\Pi_1^0$ -class belongs to  $NCR_1$ .