

Outline of Lecture 4

Randomness for Non-Uniform Distributions

- Randomness for Arbitrary Probability Measures.
- Randomness and Computability.
- Continuous Probability Measures.
- Higher Randomness for Continuous Measures.
- Randomness and Iterates of the Power Set.

Measures on Cantor Space

Definition

A **measure** on $2^{\mathbb{N}}$ is a function $\mu : 2^{<\mathbb{N}} \rightarrow [0, \infty)$ such that for all $\sigma \in 2^{<\mathbb{N}}$

$$\mu(\sigma) = \mu(\sigma 0) + \mu(\sigma 1).$$

If $\mu(\epsilon) = 1$, μ is a **probability measure**.

The **Caratheodory Extension Theorem** ensures that μ has a unique extension to the family of all Borel sets.

In the following, all measures are assumed to be probability measures.

Borel Sets

The **Borel sets** are obtained from open sets by closing under complementation and countable unions.

- The Borel sets can be ordered according their topological complexity: open/closed sets, intersections of open sets/unions of closed sets, unions of intersections of
- This yields a **hierarchy**, the **Borel hierarchy**, similar to the **arithmetical hierarchy** for sets of natural numbers: \exists/\forall , \forall/\exists , $\exists/\forall/\exists$, $\forall/\exists/\forall/\exists$, . . .

Representation of measures

- The space $\mathcal{P}(2^{\mathbb{N}})$ of all probability measures on $2^{\mathbb{N}}$ is **compact Polish**.

Compatible metric:

$$d(\mu, \nu) = \sum_{n=1}^{\infty} 2^{-n} d_n(\mu, \nu)$$

$$d_n(\mu, \nu) = \frac{1}{2} \sum_{|\sigma|=n} |\mu[\sigma] - \nu[\sigma]|.$$

- Countable dense subset: Basic measures

$$\nu_{\vec{\alpha}, \vec{q}} = \sum \alpha_i \delta_{q_i}$$

$$\sum \alpha_i = 1, \alpha_i \in \mathbb{Q}^{\geq 0}, q_i \text{ 'rational points' in } 2^{\mathbb{N}}$$

Representation of measures

- (Nice) **Cauchy sequences** of basic measures yield continuous **surjection**

$$\rho : 2^{\mathbb{N}} \rightarrow \mathcal{P}(2^{\mathbb{N}}).$$

- Surjection is **effective**: For any $X \in 2^{\mathbb{N}}$,

$$\rho^{-1}(\rho(X)) \text{ is } \Pi_1^0(X).$$

Randomness for arbitrary measures

Let μ be a probability measure on $2^{\mathbb{N}}$, R_μ a representation of μ , and let $Z \in 2^{\mathbb{N}}$.

- An R_μ - Z -test is a set $W \subseteq \mathbb{N} \times 2^{<\mathbb{N}}$ which is r.e. (Σ_1^0) in $R_\mu \oplus Z$ such that

$$\sum_{\sigma \in W_n} \mu[\sigma] \leq 2^{-n},$$

where $W_n = \{\sigma : (n, \sigma) \in W\}$.

- A real X passes a test W if $X \notin \bigcap_n [W_n]$, i.e. if it is not in the G_δ -set represented by W .
- A real X is μ - Z -random if there exists a representation R_μ so that X passes all R_μ - Z -tests.

Levin suggested a representation-free definition. Recently, Day and Miller showed that his definition of randomness agrees with the above one.

Atomic Measures

Trivial Randomness

Obviously, every sequence X is trivially random with respect to μ if $\mu(\{X\}) > 0$, i.e. if X is an atom of μ .

If we rule out trivial randomness, then being random means being non-computable.

Theorem [Reimann and Slaman]

For any sequence X , the following are equivalent.

- There exists a measure μ such that $\mu(\{X\}) = 0$ and X is μ -random.
- X is not computable.

Making Sequences Random

Features of the proof

- **Conservation of randomness.**

If Y is random for Lebesgue measure λ , and $f : 2^{\mathbb{N}} \rightarrow 2^{\mathbb{N}}$ is computable, then $f(Y)$ is random for λ_f , the **image measure**.

- A **cone** of λ -random sequences.

By the **Kucera-Gacs** Theorem, every real above $0'$ is Turing equivalent to a λ -random real.

- Relativization using the **Posner-Robinson** Theorem.

If a real is not computable, then it is above the jump relative to some G .

- A **compactness argument** for measures.

Making Reals Random

Conservation of randomness

Let μ be a probability measure and $f : 2^{\mathbb{N}} \rightarrow 2^{\mathbb{N}}$ be a continuous (Borel) function.

Define the **image measure** μ_f by setting

$$\mu_f(\sigma) = \mu(f^{-1}[\sigma])$$

Conservation of randomness

If the transformation f is computable in \mathbb{Z} , then it preserves randomness, i.e. it maps a μ - \mathbb{Z} -random real to a μ_f - \mathbb{Z} -random one.

Non-trivial Randomness

Cones and relativization

Kucera's coding argument:

- Every degree above \emptyset' contains a λ -random.

Relativization:

- **Posner-Robinson Theorem:** For every non-computable sequence X there exists a G such that $X \oplus G \geq_T G'$, i.e. relative to G , X is above the jump.

Conclude that every non-computable sequence X is **Turing equivalent to some λ - G -random sequence R** for some real G .

Non-Trivial Randomness

Making reals random

The Turing equivalence to a λ -random real translates into an **effectively closed set** of probability measures.

- The following basis theorem (indep. by **Downey, Hirschfeldt, Miller, and Nies**) ensures that one of the measures will not affect the randomness of R .

Theorem

If $B \subseteq 2^{\mathbb{N}}$ is nonempty and Π_1^0 , then, for every R which is λ -random there is $Z \in B$ such that R is λ - Z -random.

- This argument seems to be applicable in more generality, proving **existence of measures**.

Randomness for Continuous Measures

In the proof we have little control over the measure that makes x random.

- In particular, atoms cannot be avoided (due to the use of **Turing reducibilities**).

Question

*What if one admits only **continuous** (i.e. non-atomic) probability measures?*

The Class NCR

Let NCR_n be the set of all reals which are not n -random with respect to any continuous measure.

Question

What is the structure/size of NCR_n ?

- *Is there a level of logical complexity that guarantees continuous randomness?*
- *Can we reproduce the proof that a non-computable real is random at a higher level?*

The Class NCR

Upper bound

NCR_n is a Π_1^1 set, i.e. its complement is the image of an effectively closed set under an effectively continuous transformation.

- NCR_n does not have a perfect subset.
- **Solovay, Mansfield:** Every Π_1^1 set of reals without a perfect subset must be contained in L .

The Constructible Universe

Definition

Gödel's hierarchy of constructible sets L is defined by the following recursion.

- $L_0 = \emptyset$
- $L_{\alpha+1} = \text{Def}(L_\alpha)$, the set of subsets of L_α which are first order definable in parameters over L_α .
- $L_\lambda = \bigcup_{\alpha < \lambda} L_\alpha$.

Randomness for Continuous Measures

One can analyze the proof of the previous theorem to obtain a more recursion theoretic characterization of continuous randomness.

Theorem

Let X be a sequence. For any $Z \in 2^{\mathbb{N}}$, the following are equivalent.

- Z is random for a continuous measure computable in Z .
- There exists a functional Φ computable in Z which is an order-preserving homeomorphism of $2^{\mathbb{N}}$ such that $\Phi(X)$ is λ - Z -random.
- X is truth-table equivalent (relative to Z) to a λ - Z -random real.

This is an effective version of the **classical isomorphism theorem** for continuous probability measures.

The Structure of NCR_1

A sequence X is **hyperarithmetical** if it is recursive in some $\emptyset^{(\alpha)}$, where α is a **recursive ordinal**.

- **Woodin**: outside the hyperarithmetical sequences, the Posner-Robinson theorem holds for a truth-table reduction.
- Conclude that all elements of NCR_1 are hyperarithmetical. In other words, if X is not hyperarithmetical, it is random for some continuous measure.

The Structure of NCR_n

For larger n , we can still show:

Theorem [Reimann and Slaman]

For all n , NCR_n is countable.

Examples of higher order

Theorem

Kleene's \mathcal{O} is an element of NCR_3 .

Based on this, one can use the theory of **jump operators** (Jockusch and Shore) to obtain a whole class of examples.

Proof:

- Tree representation $\mathcal{O} = \{e : \text{the } e\text{th computable tree } T_e \subseteq \omega^{<\omega} \text{ is well-founded}\}$.
- Suppose \mathcal{O} is 3-random for some μ .
- We want to use **domination properties** of random reals.

The Class NCR

Examples of higher order

- **Well-known** (Kurtz and others): If X is n -random for μ , $n > 1$, then every function $f \leq_T X$ is dominated by a function computable in μ' .
- Therefore, μ' computes a uniform family $\{g_e\}$ of functions dominating the leftmost infinite path of T_e .
- Infer: For every e , the following are equivalent.
 - (i) T_e is well-founded.
 - (ii) The subtree of T_e to the left of g_e is finite.
- The latter condition is $\Pi_1^0(\mu')$, hence \mathcal{O} is $\Pi_2^0(\mu)$.
- But this is impossible if \mathcal{O} is 3-random for μ .

NCR_n is Countable

Main Features of the Proof

- Produce an **upper cone** in the Turing degrees of reals that **are** random for a continuous measure.
 - Borel-Turing determinacy
- **Generalize the Posner-Robinson-Theorem** to cases of higher complexity.
 - Kumabe-Slaman forcing

Borel Determinacy

Consider the following game: Let $\mathcal{A} \subseteq 2^{\mathbb{N}}$.

- **Player I** plays $X(0)$.
- **Player II** plays $X(1)$.
- **I** plays $X(2)$.
- **II** plays $X(3)$.
- \vdots

The **outcome** of the play a sequence $X \in 2^{\mathbb{N}}$.

- Player I wins if $X \in \mathcal{A}$.
- Player II wins if $X \notin \mathcal{A}$.

Borel Determinacy

Theorem (Martin)

*If \mathcal{A} is Borel, then one of the players has a **winning strategy**.*

An application is **Borel Turing Determinacy**:

If \mathcal{A} is Borel and invariant under Turing equivalence, then either \mathcal{A} or its complement contains an upper cone in the Turing degrees.

An Upper Cone of Random Sequences

An upper cone of continuously random sequences

- Show that the complement of NCR_n contains a Turing invariant and cofinal (in the Turing degrees) Borel set.
- We can use the set of all X that are Turing equivalent to some $Z \oplus R$, where R is $(n + 1)$ -random relative to a given Z .
- These X will be n -random relative to some continuous measure and are T -above Z .
- Use **Borel Turing determinacy** to infer that the complement of NCR_n contains a cone.
- The base of the cone is given by the **Turing degree of a winning strategy** in the corresponding game.

Location inside the Constructible Hierarchy

- The direct nature of Martin's proof implies that the winning strategy for that game belongs to the smallest L_β such that L_β is a model of ZFC.
- The more complicated the game is in the Borel hierarchy, the more iterates of the power set of the continuum are used in producing the winning strategy – trees, trees of trees, etc.
- More precisely, the winning strategy (for Borel complexity n) is contained in

$$L_{\beta_n} \models \text{ZFC}_n^-$$

where ZFC_n^- is Zermelo-Fraenkel set theory without the Power Set Axiom + “there exist n many iterates of the power set of $2^{\mathbb{N}}$ ”.

Relativization via Forcing

Posner-Robinson-style relativization

- Given $X \notin L_{\beta_n}$, using forcing we construct a set G such that $L_{\beta_n}[G] \models \text{ZFC}_n^-$ and

$$Y \in L_{\beta_n}[G] \cap 2^{\mathbb{N}} \quad \text{implies} \quad Y \leq_T X \oplus G$$

(independently by **Woodin**).

- If X is not in L_{β_n} , it will belong to every cone with base in the accordant $L_{\beta_n}[G]$, in particular, it will belong to the cone avoiding NCR_n .

Metamathematics Necessary?

Question

Do we really need the existence of iterates of the power set of the reals to prove the countability of NCR_n , a set of reals?

We make **fundamental use of Borel determinacy**; this suggests to analyze the metamathematics in this context.

Borel Determinacy and Iterates of the Power Set

Necessity of power sets – Friedman's result

- **Friedman** showed

$ZFC^- \not\vdash \Sigma_5^0$ -determinacy.

(**Martin** improved this to Σ_4^0 .)

- The proof works by showing that there is a **model of ZFC^- for which Σ_4^0 -determinacy does not hold**. This model is L_{β_0} .

Based on this, Friedman showed that in order to prove Borel determinacy, one has to assume the **existence of infinitely many iterates of the power set**.

NCR and Iterates of the Power Set

We can prove a similar result concerning the countability of NCR_n .

Theorem

For every k ,

$\text{ZFC}_k^- \not\vdash$ “For every n , NCR_n is countable”.

NCR and Iterates of the Power Set

NCR_n is not countable in L_{β_0}

- Show that there is an n such that NCR_n is cofinal in the Turing degrees of L_{β_0} . (The approach does not change essentially for higher k .)
- The non-random witnesses will be the reals which code the full inductive constructions of the initial segments of L_{β_0} .

Randomness does not accelerate defining reals

Suppose that $n \geq 2$, $Y \in 2^{\mathbb{N}}$, and X is n -random for μ . Then, for $i < n$,

$$Y \leq_T X \oplus \mu \text{ and } Y \leq_T \mu^{(i)} \text{ implies } Y \leq_T \mu.$$

NCR and Iterates of the Power Set

Example

For all k , $0^{(k)}$ is not 3-random for any μ .

Proof.

- Suppose $0^{(k)}$ is 3-random relative to μ .
- $0'$ is computably enumerable relative to μ and computable in the supposedly 3-random $0^{(k)}$. Hence, $0'$ is computable in μ and so $0''$ is computably enumerable relative to μ .
- Use induction to conclude $0^{(k)}$ is computable in μ , a contradiction.



NCR and Iterates of the Power Set

As with arithmetic definability, for $n \geq 5$, n -random reals cannot accelerate the calculation of well-foundedness.

Lemma

Suppose that X is 5-random relative to μ , \prec is a linear ordering computable in μ , and I is the largest initial segment of \prec which is well-founded. If I is computable in $X \oplus \mu$, then I is computable in μ .

L_α 's and their master codes

Master codes

- L_α , $\alpha < \beta_0$, is a countable structure obtained by iterating first order definability over smaller L_γ 's and taking unions.
- Jensen's master codes are sequences $M_\alpha \in 2^{\mathbb{N}} \cap L_{\beta_0}$, for $\alpha < \beta_0$, that represent these countable structures.
- M_α is obtained from smaller M_γ 's by iterating the Turing jump and taking arithmetically definable limits.
- Every $X \in 2^{\mathbb{N}} \cap L_{\beta_0}$ is computable in some M_α .

Master codes are not random

An inductive argument similar to the example $0^{(k)} \in \text{NCR}_3$, using the non-helpfulness lemmas, can be applied transfinitely to these master-codes.

Theorem

There is an n such that for all limit α , if $\alpha < \beta_0$, then there is no continuous measure μ such that M_α is n -random relative to μ .