

Conditional probability and Van Lambalgen's theorem

Bruno Bauwens,
presenting work from Hayato Takahashi,
Alexander Shen, Laurent Bienvenu, Jason Rute

On leave from Ghent University (in Belgium) to
National Research University Higher School of Economics (HSE), Moscow.

26/6/2015 CCR Heidelberg

- 1 Conditional probability
- 2 Van Lambalgen's theorem fails for computable \mathcal{P}
- 3 H. Takahashi's generalization of van Lambalgen's theorem

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (van Lambalgen)

The following are equivalent:

- 1 (α, β) is Martin-Löf random,
- 2 α is Martin-Löf random and β is Martin-Löf random relative to α .

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$$

Theorem (van Lambalgen)

The following are equivalent:

- 1 (α, β) is Martin-Löf random,
- 2 α is Martin-Löf random and β is Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by $P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot | \alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot | \alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot | \alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot | \alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot | \alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Problems:

- What is $P(\cdot|\alpha)$?
- Is it computable?
- What is randomness relative to uncomputable measure?

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Problems:

- What is $P(\cdot|\alpha)$?
- Is it computable?
- What is randomness relative to uncomputable measure?

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).

Goal: find new structure. Assume known structure is described by

$P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Problems:

- What is $P(\cdot|\alpha)$?
- Is it computable?
- What is randomness relative to uncomputable measure?

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).
Goal: find new structure. Assume known structure is described by $P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Problems:

- What is $P(\cdot|\alpha)$?
- Is it computable?
- What is randomness relative to uncomputable measure?

Theorem (Vovk & Uspensky)

The following are equivalent for all computable bivariate measures P for which $P(\cdot|\alpha)$ is uniformly computable in α :

- 1 (α, β) is P -Martin-Löf random,
- 2 α is $P(\cdot, \lambda)$ -Martin-Löf random, and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Goal: van Lambalgen's theorem for computable measure

Philosophically: following tasks are equally hard:

- Finding structure in a pair of sequences
- Finding structure in the first sequence and finding structure in the second relative to the first.

$\Omega = \{0, 1\}^{\mathbb{N}} = \text{Cantor space}$

Theorem (?)

The following are equivalent for computable measure P on $\Omega \times \Omega$:

- 1 (α, β) is $P(\cdot, \cdot)$ -Martin-Löf random,
- 2 α is $P(\cdot, \Omega)$ -Martin-Löf random and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Suppose some structure is known, (e.g. every 3th bit is zero).
Goal: find new structure. Assume known structure is described by $P(\cdot, \cdot)$. Can we again split the work into two separate tasks?

Definitions:

- $U \subset \Omega$ is effectively open if $U = [x_1] \cup [x_2] \cup \dots$ for a c.e. set $\{x_1, x_2, \dots\}$
- $\alpha \in \Omega$ is Q -Martin-Löf random if for all uniformly effectively open family of sets $U_n \subset \Omega$ for which $Q(U_n) \leq 2^{-n}$: $\alpha \notin \bigcap_n U_n$.
- $U \subset \Omega \times \Omega$ is effectively open if $U = ([x_1] \times [y_1]) \cup ([x_2] \times [y_2]) \cup \dots$ with $\{(x_1, y_1), (x_2, y_2), \dots\}$ c.e.
- $(\alpha, \beta) \in \Omega \times \Omega$ is P -Martin-Löf random if $\dots P(U_n) \leq 2^{-n} \dots$

Problems:

- What is $P(\cdot|\alpha)$?
- Is it computable?
- What is randomness relative to uncomputable measure?

Theorem (Vovk & Uspensky)

The following are equivalent for all computable bivariate measures P for which $P(\cdot|\alpha)$ is uniformly computable in α :

- 1 (α, β) is P -Martin-Löf random,
- 2 α is $P(\cdot, \lambda)$ -Martin-Löf random, and β is $P(\cdot|\alpha)$ -Martin-Löf random relative to α .

Theorem (Folklore)

The following are equivalent for all measures P and Q :

- 1 (α, β) is $(P \times Q)$ -Martin-Löf random relative to a sequence that computes $(P \times Q)$,
- 2 α is P -Martin-Löf random relative to some sequence that computes P , and β is Q -Martin-Löf random relative to α and some sequence that computes Q .

- 1 Conditional probability
- 2 Van Lambalgen's theorem fails for computable P
- 3 H. Takahashi's generalization of van Lambalgen's theorem

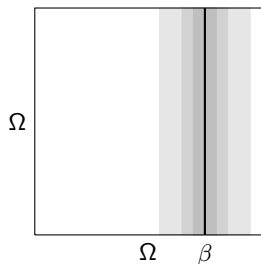
Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist. . .

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



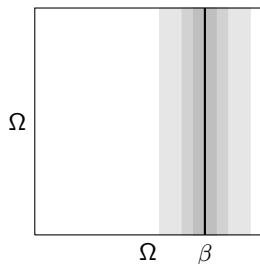
Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist. . .

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



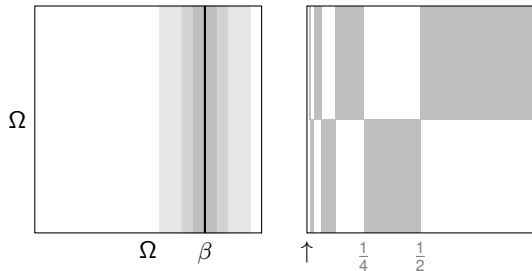
Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



y	λ	0	00	000	...
$P(0, y)$...
$P(\lambda, y)$...
$P(1, y)$...
$P(\lambda, y)$...

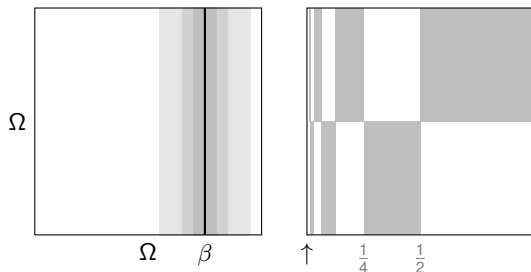
Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



y	λ	0	00	000	...
$\frac{P(0,y)}{P(\lambda,y)}$	2/3	1/3	2/3	1/3	...
$\frac{P(1,y)}{P(\lambda,y)}$	1/3	2/3	1/3	2/3	...

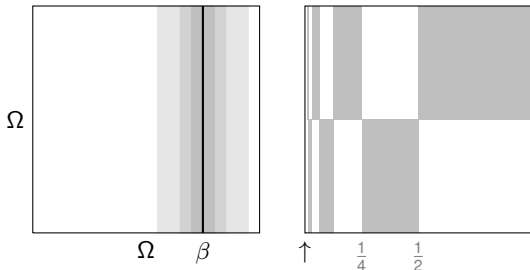
Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



y	λ	0	00	000	...
$\frac{P(0,y)}{P(\lambda,y)}$	2/3	1/3	2/3	1/3	...
$\frac{P(1,y)}{P(\lambda,y)}$	1/3	2/3	1/3	2/3	...

→ $v(\cdot|00\dots)$ does not exist

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

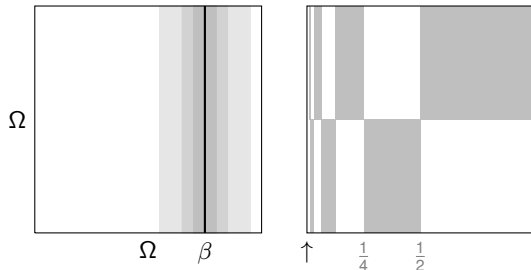
$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



y	λ	0	00	000	...
$\frac{P(0,y)}{P(\lambda,y)}$	2/3	1/3	2/3	1/3	...
$\frac{P(1,y)}{P(\lambda,y)}$	1/3	2/3	1/3	2/3	...

$\rightarrow v(\cdot|00\dots)$ does not exist

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

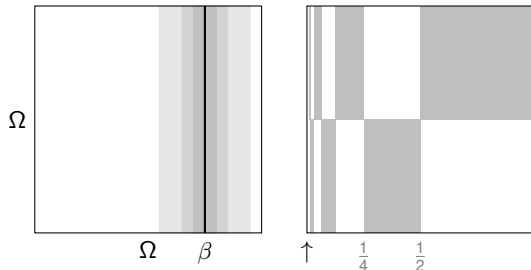
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



y	λ	0	00	000	...
$\frac{P(0,y)}{P(\lambda,y)}$	2/3	1/3	2/3	1/3	...
$\frac{P(1,y)}{P(\lambda,y)}$	1/3	2/3	1/3	2/3	...

$\rightarrow v(\cdot|00\dots)$ does not exist

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

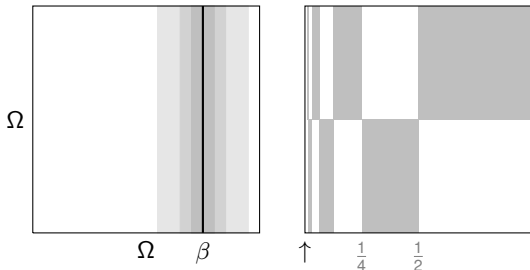
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:



y	λ	0	00	000	...
$\frac{P(0,y)}{P(\lambda,y)}$	2/3	1/3	2/3	1/3	...
$\frac{P(1,y)}{P(\lambda,y)}$	1/3	2/3	1/3	2/3	...

$\rightarrow v(\cdot|00\dots)$ does not exist

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

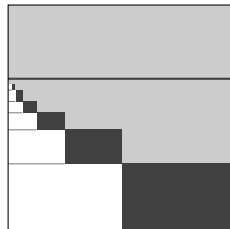
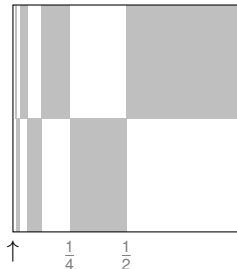
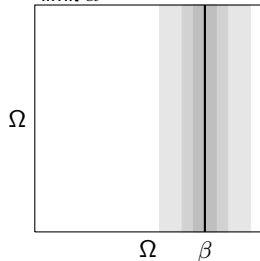
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00\dots 0)}{P(\lambda, 00\dots 0)}$$

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

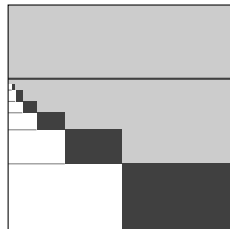
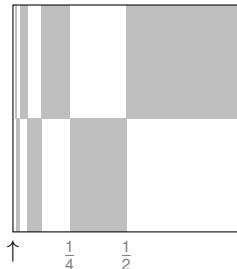
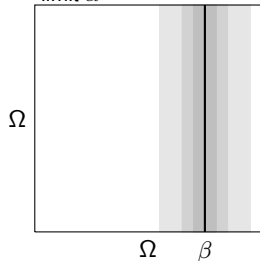
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00\dots 0)}{P(\lambda, 00\dots 0)}$$

zero below α
uniform above α

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

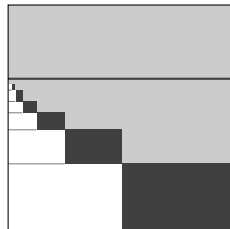
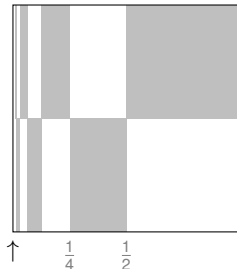
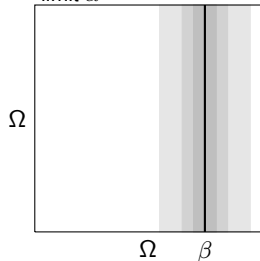
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00\dots 0)}{P(\lambda, 00\dots 0)}$$

zero below α
uniform above α

$P(\cdot|00\dots)$ incomputable

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

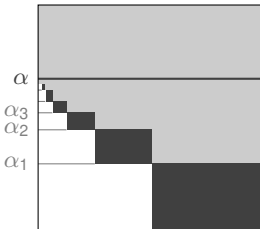
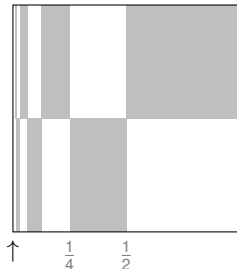
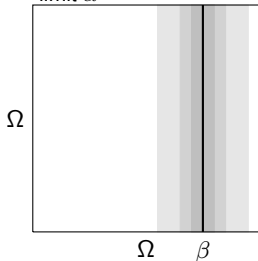
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00 \dots 0)}{P(\lambda, 00 \dots 0)}$$

zero below α
uniform above α

$P(\cdot|00 \dots)$ incomputable

$P(x, y)$ comp. in $|y|$ "steps"

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

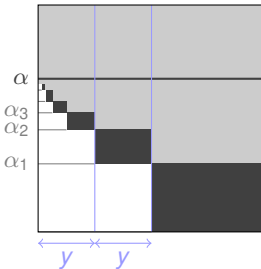
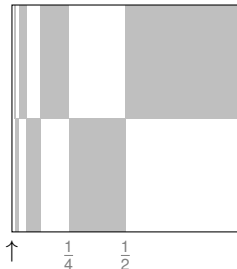
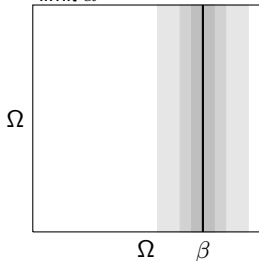
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00\dots 0)}{P(\lambda, 00\dots 0)}$$

zero below α
uniform above α

$P(\cdot|00\dots)$ incomputable

$P(x, y)$ comp. in $|y|$ "steps"

Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

$P(\cdot|\alpha)$ incomputable
for almost all α .

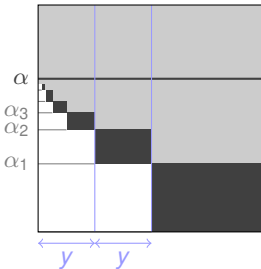
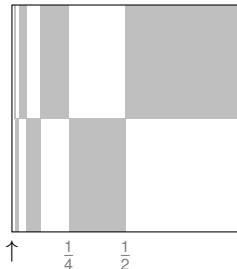
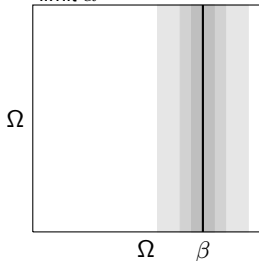
- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00\dots 0)}{P(\lambda, 00\dots 0)}$$

zero below α
uniform above α

$P(\cdot|00\dots)$ incomputable

$P(x, y)$ comp. in $|y|$ "steps"

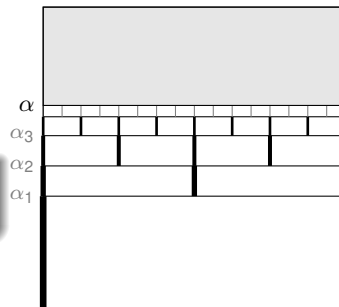
Conditional probability in continuous space

- P is measure on $\Omega \times \Omega$, let $P(x, y) = P([x], [y])$.

$$v(x|\beta) = \lim_{n \rightarrow \infty} \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}, \quad h(y) = P(\Omega, y).$$

- If $P(x, y) = Q(x)R(y)$, then $v(x|\beta) = Q(x)$.
- $v(x|\beta)$ might not exist...

$P(\cdot|\alpha)$ incomputable
for almost all α .

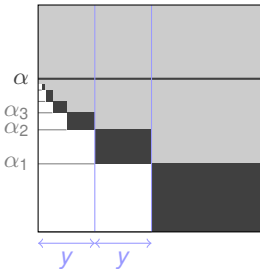
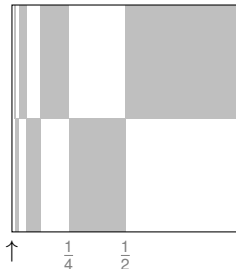
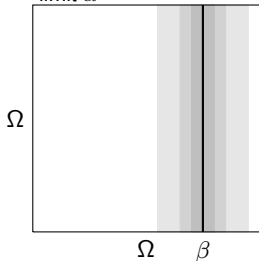


Theorem (Takahashi)

If β is h -Martin-Löf random, then $v(\cdot|\beta)$ exists and is a measure.

Proof: $\frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$ is a h -martingale, if it oscillates: buy low, sell high.

- Computable P , still $v(\cdot|\alpha)$ might not be computable [AFR2011]:
 $\alpha_1 \leq \alpha_2 \leq \dots$ computable binary rational sequence with incomputable limit α



$$\lim \frac{P(\cdot, 00 \dots 0)}{P(\lambda, 00 \dots 0)}$$

zero below α
uniform above α

$P(\cdot|00 \dots)$ incomputable

$P(x, y)$ comp. in $|y|$ "steps"

- 1 Conditional probability
- 2 Van Lambalgen's theorem fails for computable P
- 3 H. Takahashi's generalization of van Lambalgen's theorem

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

- $R \models \alpha_{|y|}, \alpha_{|y|+1} [\times [y]]?$
- $R \models r, s [\times [y]]$ with $\alpha_{|y|} \leq r < s?$
- $R \models r, s [\times [y]]$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

- $R \models \alpha_{|y|}, \alpha_{|y|+1} [\times [y]]?$
- $R \models r, s [\times [y]]$ with $\alpha_{|y|} \leq r < s?$
- $R \models r, s [\times [y]]$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

- $R \equiv]\alpha_{|y|}, \alpha_{|y|+1}[\times]y[$?
- $R \equiv]r, s[\times]y[$ with $\alpha_{|y|} \leq r < s$?
- $R \equiv]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Blind randoms \subset uniformly randoms

- $R \models \alpha_{|y|}, \alpha_{|y|+1} \times [y]?$
- $R \models r, s \times [y]$ with $\alpha_{|y|} \leq r < s?$
- $R \models r, s \times [y]$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Blind randoms \subset uniformly randoms

- $R =]\alpha_{|y}, \alpha_{|y+1}[\times]y?$
- $R =]r, s[\times]y$ with $\alpha_{|y} \leq r < s?$
- $R =]r, s[\times]y$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

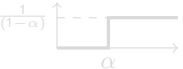
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

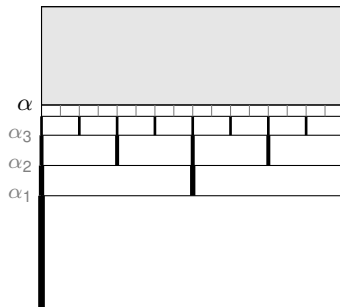
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y?$
- $R =]r, s[\times]y$ with $\alpha_{|y}| \leq r < s?$
- $R =]r, s[\times]y$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

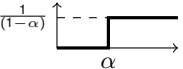
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

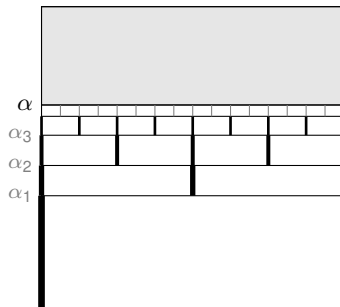
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y?$
- $R =]r, s[\times]y$ with $\alpha_{|y}| \leq r < s?$
- $R =]r, s[\times]y$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

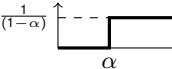
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

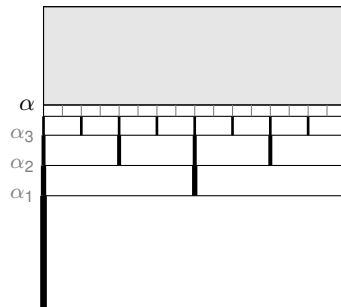
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y|} \leq r < s?$
- $R =]r, s[\times]y[$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

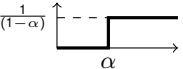
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

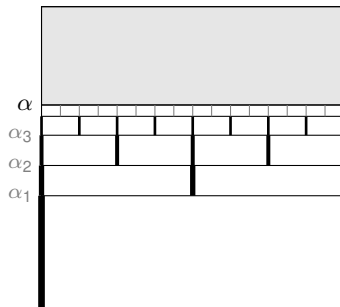
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s?$
- $R =]r, s[\times]y[$ with $r < s?$

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

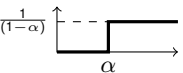
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

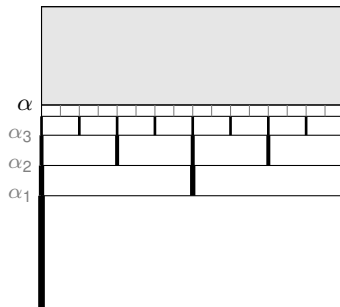
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

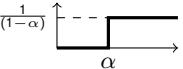
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

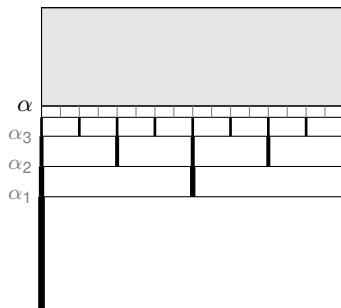
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

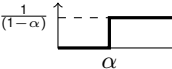
- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

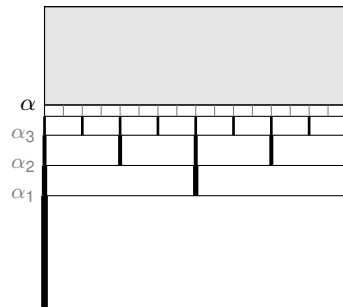
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y|} \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

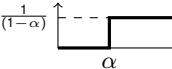
- α is *Hippocratic (blind)* Q -random if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly* Q -random if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

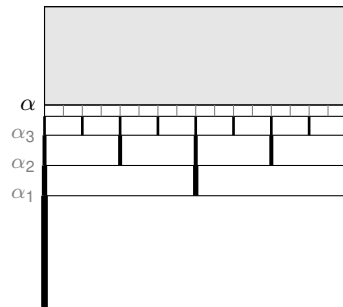
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

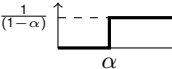
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

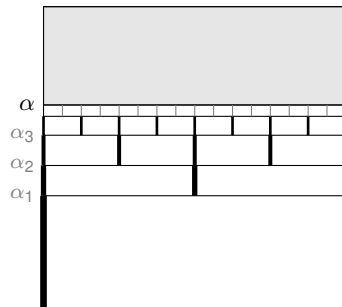
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

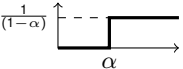
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

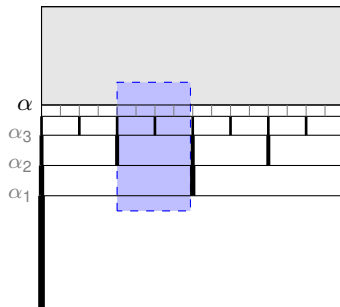
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

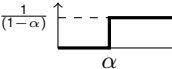
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

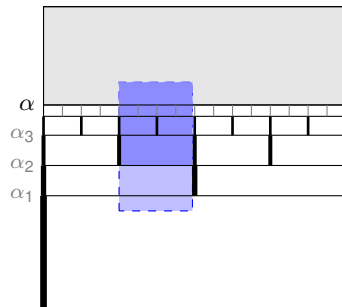
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y}|, \alpha_{|y|+1}[\times]y[$?
- $R =]r, s[\times]y[$ with $\alpha_{|y}| \leq r < s$?
- $R =]r, s[\times]y[$ with $r < s$?

Van Lambalgen's theorem fails for computable P

Non-computable measure Q :

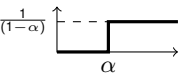
- α is *Hippocratic (blind) Q-random* if $\alpha \in \bigcap_n U_n$ for all uniformly effectively open U_n st $Q(U_n) \leq 2^{-n}$
- α is *uniformly Q-random* if there exists a sequence ξ that computes Q , such that $\alpha \in \bigcup_n U_n$ for all uniformly ξ -effectively open U_n with $Q(U_n) \leq 2^{-n}$.

Theorem (B.)

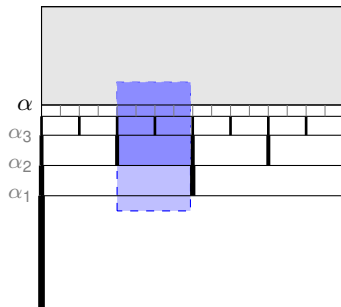
There exists a computable P and a pair (α, β) such that

- (α, β) is P -Martin-Löf random
- α is not blind $v(\cdot|\beta)$ -random (even without oracle β).

Proof:

- Choose $\alpha_1 \leq \alpha_2 \leq \dots$ be computable rational sequence with limit Martin-Löf random limit α . P as before.
- $v(\cdot|\beta)$ for β with infinitely many ones: 
- Conditional test: $U_n = [0, \alpha + 2^{-n}]$.
($v(U_n|\beta) = 2^{-n}/(1 - \alpha)$) \rightarrow thus α not $v(\cdot|\beta)$ random.
- Choose β s.t. (α, β) is ML μ -random, i.e. β is 2-random.
- Convert P ML-test V_n to a μ ML-test W_n with same intersection on horizontal line at α :
if $]r, s[\times]y$ is enumerated in V_n , cut part below $\alpha_{|y|}$ and enumerate in W_n . $P(U_n) \geq \mu(V_n)$.

Blind randoms \subset uniformly randoms



Quiz: let μ be uniform measure, is $P(R) = \mu(R)$ for

- $R =]\alpha_{|y|}, \alpha_{|y|+1}[\times]y$?
- $R =]r, s[\times]y$ with $\alpha_{|y|} \leq r < s$?
- $R =]r, s[\times]y$ with $r < s$?

- 1 Conditional probability
- 2 Van Lambalgen's theorem fails for computable P
- 3 H. Takahashi's generalization of van Lambalgen's theorem

Generalize van Lambalgen's theorem

Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is P -Martin-Löf random,
- 2 β is h -Martin-Löf random and α is $v(\cdot|\beta)$ -Martin-Löf random r.t. β .

Generalize van Lambalgen's theorem

Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is **not** P -Martin-Löf random,
- 2 β is **not** h -Martin-Löf random **or** α is **not** $v(\cdot|\beta)$ -Martin-Löf random r.t. β .

Generalize van Lambalgen's theorem

Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Generalize van Lambalgen's theorem

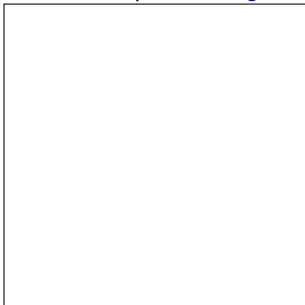
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

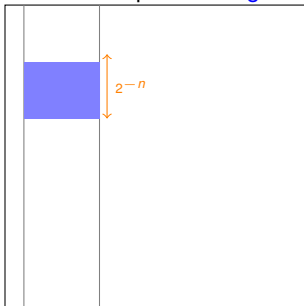
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

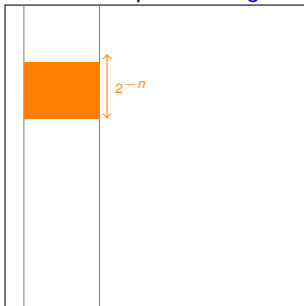
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

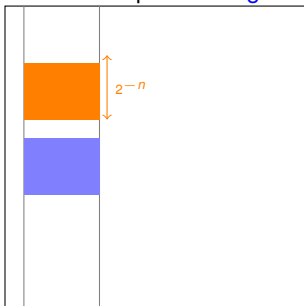
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

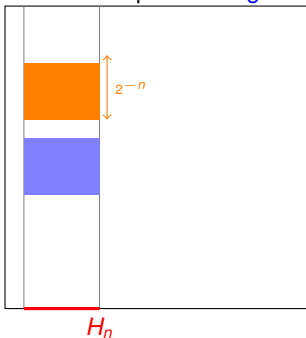
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

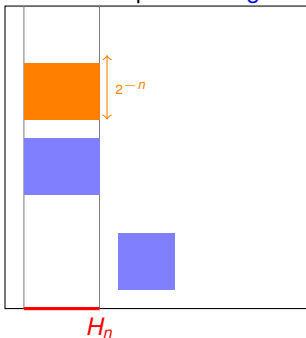
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

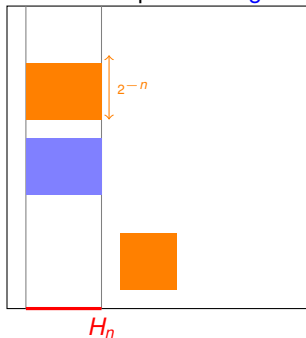
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

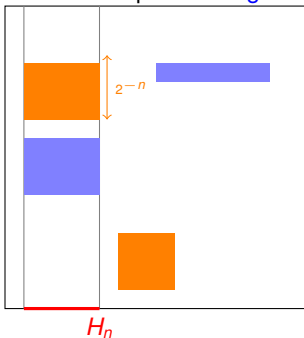
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

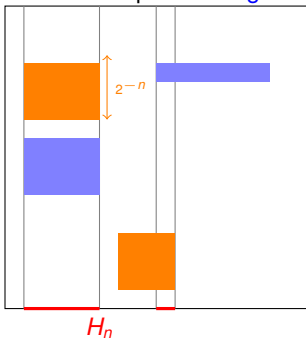
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

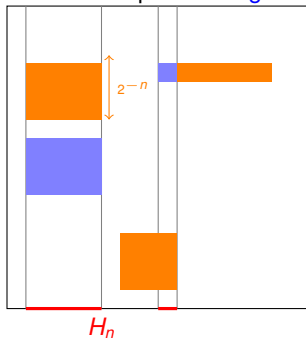
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

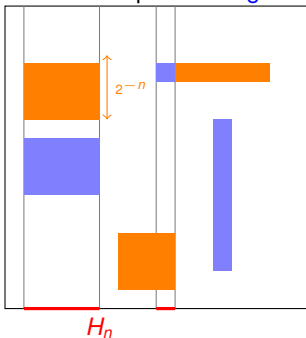
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

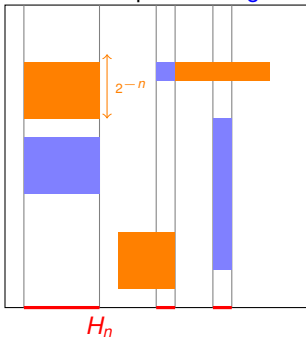
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

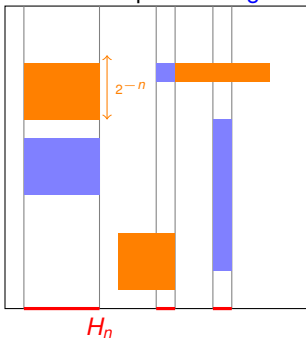
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Generalize van Lambalgen's theorem

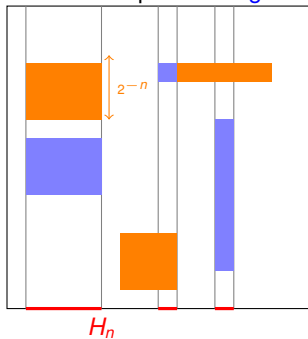
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Verification:

- Clearly, $\mu(V_n^\beta) \leq 2^{-n}$ and 2nd criterium are OK.
- Note $\mu(U_{2n}) \geq 2^{-n} \mu(H_n)$, hence, $2^{-2n}/2^{-n} \geq \mu(H_n)$.
- Proof theorem: suppose (α, β) is not random, one of the cases in 2nd criterium happens infinitely often, this is enough for non Martin-Löf randomness

Generalize van Lambalgen's theorem

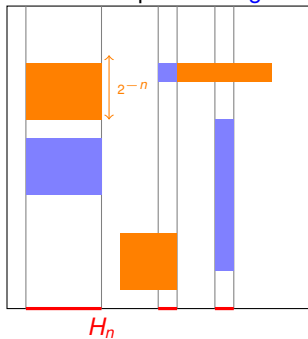
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Verification:

- Clearly, $\mu(V_n^\beta) \leq 2^{-n}$ and 2nd criterium are OK.
- Note $\mu(U_{2n}) \geq 2^{-n}\mu(H_n)$, hence, $2^{-2n}/2^{-n} \geq \mu(H_n)$.
- Proof theorem: suppose (α, β) is not random, one of the cases in 2nd criterium happens infinitely often, this is enough for non Martin-Löf randomness

Generalize van Lambalgen's theorem

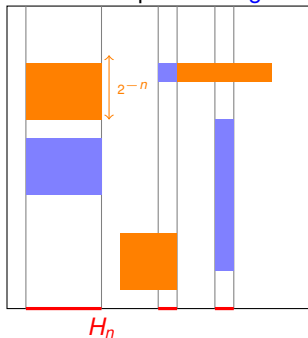
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(-|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Verification:

- Clearly, $\mu(V_n^\beta) \leq 2^{-n}$ and 2nd criterium are OK.
- Note $\mu(U_{2n}) \geq 2^{-n}\mu(H_n)$, hence, $2^{-2n}/2^{-n} \geq \mu(H_n)$.
- Proof theorem: suppose (α, β) is not random, one of the cases in 2nd criterium happens infinitely often, this is enough for non Martin-Löf randomness

Generalize van Lambalgen's theorem

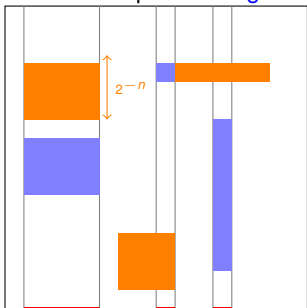
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not μ -Martin-Löf random, \rightarrow test U_n
- 2 β is not μ -Martin-Löf random or α is not μ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



H_n

Alternative arg $\mu(H_n) \leq \varepsilon$ (Bienvenu):

- $f(y) = \mu(U_{2n} \cap y\text{-stripe}) / \mu(y)$ is a martingale
- $\mu\left(\bigcup_{f(y) \geq \varepsilon} [y]\right) \leq f(\lambda) / \varepsilon$
- left $\mu(H_n)$, right $\mu(U_{2n}) / \varepsilon \leq \varepsilon^2 / \varepsilon$

Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $\mu(V_n^\beta) \leq \varepsilon$ for all β and $\mu(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $\mu(V_n^\beta) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Verification:

- Clearly, $\mu(V_n^\beta) \leq 2^{-n}$ and 2nd criterium are OK.
- Note $\mu(U_{2n}) \geq 2^{-n} \mu(H_n)$, hence, $2^{-2n} / 2^{-n} \geq \mu(H_n)$.
- Proof theorem: suppose (α, β) is not random, one of the cases in 2nd criterium happens infinitely often, this is enough for non Martin-Löf randomness

Generalize van Lambalgen's theorem

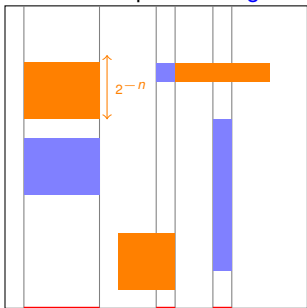
Recall $h(y) = P(\text{empty string}, y)$ and $v(x|\beta) = \lim \frac{P(x, \beta_1 \dots \beta_n)}{h(\beta_1 \dots \beta_n)}$

Theorem (H.Takahashi)

For a computable P and a sequence β for which $v(\cdot|\beta)$ is computable, the following are equivalent:

- 1 (α, β) is not P -Martin-Löf random, \rightarrow test U_n
- 2 β is not h -Martin-Löf random or α is not $v(\cdot|\beta)$ -Martin-Löf random r.t. β . \rightarrow tests H_n and V_n^β

Proof that 1 implies 2: [original](#) argument, i.e., all uniform measures:



H_n

Alternative arg $h(H_n) \leq \varepsilon$ (Bienvenu):

- $f(y) = P(U_{2n} \cap y\text{-stripe})/h(y)$ is a martingale
- $P\left(\bigcup_{f(y) \geq \varepsilon} [y]\right) \leq f(\lambda)/\varepsilon$
- left $h(H_n)$, right $P(U_{2n})/\varepsilon \leq \varepsilon^2/\varepsilon$

Criteria construction H_n and V_n^β (let $\varepsilon = 2^{-n}$, thus $U_{2n} \leq \varepsilon^2$):

- $v(V_n^\beta|\beta) \leq \varepsilon$ for all β and $h(H_n) \leq \varepsilon$,
- for all $(\alpha, \beta) \in U_{2n}$, either $\alpha \in V_n^\beta$ or $\beta \in H_n$

Construction:

- Each rectangle $I \times [b]$ enumerated in U_{2n} , if $v(V_n^\beta|b) \leq \varepsilon$, enumerate I in V_n^β for $\beta \in [b]$
- Enumerate in H_n the complementary part of $[b]$.

Verification:

- Clearly, $v(V_n^\beta|\beta) \leq 2^{-n}$ and 2nd criterium are OK.
- Note $\mu(U_{2n}) \geq 2^{-n}\mu(H_n)$, hence, $2^{-2n}/2^{-n} \geq \mu(H_n)$.
- Proof theorem: suppose (α, β) is not random, one of the cases in 2nd criterium happens infinitely often, this is enough for non Martin-Löf randomness