

Algebraic Terms through Simulated Biological Evolution

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A finite non-trivial groupoid \mathbf{G} is **idemprial** if it has no non-trivial subalgebras, automorphisms or congruences and the ternary discriminator operation

$$t(a, b, c) := \begin{cases} a & \text{if } a = b \\ c & \text{if } a \neq b \end{cases}$$

is a term operation of \mathbf{G} .

Murskiĭ's Theorem. (1975) *The proportion of n -element groupoids $\mathbf{G} = \langle \{0, 1, 2, \dots, n-1\}, * \rangle$ that are idemprial approaches 1 as $n \rightarrow \infty$.*

Murskiĭ's Theorem. (1975) *The proportion of n -element groupoids $\mathbf{G} = \langle \{0, 1, 2, \dots, n-1\}, * \rangle$ that are idempotential approaches 1 as $n \rightarrow \infty$.*

Problem:

Is this groupoid idempotential?

$$\mathbf{P}_i := \langle \{0, 1, 2, 3, 4\}, * \rangle$$

*	0	1	2	3	4
0	1	4	1	0	4
1	2	1	0	3	0
2	3	4	2	4	3
3	2	3	3	4	1
4	2	1	4	3	3

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Problem:

Is this groupoid idempurimal?

$$\mathbf{P}_i := \langle \{0, 1, 2, 3, 4\}, * \rangle$$

– if and only if it has a
discriminator term

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1	2	1	0	3	0
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3	2	3	3	4	1
4	2	1	4	3	3

Term Generation Problem: Given a finite groupoid \mathbf{G} and an operation $h : G^k \rightarrow G$ that is a term operation of \mathbf{G} , find a term that represents h .

Let $\mathbf{G} = \langle \{0, 1, 2, 3, 4\}, * \rangle$ be a 5-element idemprial groupoid.
Two prior methods might generate a discriminator term.

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BUT, if \mathbf{G} has 2 idempotents, $\mathbf{F}_3(\mathbf{G})$ will have 5^{123} elements. Checking 10^6 terms per second, the expected time to find a discriminator term will be $\approx 10^{72}$ years(!!)

Evolutionary computation finds solutions to problems by
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The **fitness** of a term $t(\vec{x})$ to represent $h : G^k \rightarrow G$ is

$$\text{fit}(t(\vec{x})) := |\{\vec{b} \in G^k : t(\vec{b}) = h(\vec{b})\}|.$$

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\mathbb{M} , a set of **male terms** $m(\vec{x})$;

\mathbb{F} , a set of **female terms** $f(\vec{x}, \diamond)$, each containing a single occurrence of the new variable \diamond (the **lozenge**).

$$\begin{array}{ccccc} m(\vec{x}) & + & f(\vec{x}, \diamond) & \implies & f(\vec{x}, m(\vec{x})) \\ \textit{father} & & \textit{mother} & & \textit{child} \end{array}$$

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The **fitness** of a male term $m(\vec{x})$ is

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The **fitness** of a female term $f(\vec{x}, \diamond)$ is

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A Basic Bucket System

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\mathbb{M}		\mathbb{F}	
\mathbb{M}_{n^k}	$\boxed{?}$	$\boxed{?}$	\mathbb{F}_{n^k}
	\vdots	\vdots	
\mathbb{M}_1	$\boxed{(x_4 x_1) x_3^2}$	$\boxed{\diamond \quad x_2 \diamond}$	\mathbb{F}_1
\mathbb{M}_0	$\boxed{x_0 x_2 \quad x_3}$	$\boxed{x_2 (x_3 \diamond)}$	\mathbb{F}_0

Initialize buckets.

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\mathbb{M}		\mathbb{F}	
\mathbb{M}_{n^k}	<div></div>	<div></div>	\mathbb{F}_{n^k}
	\vdots	\vdots	
\mathbb{M}_1	<div></div>	<div></div>	\mathbb{F}_1
\mathbb{M}_0	<div>x_0x_2 x_3</div>	<div>\diamond</div>	\mathbb{F}_0

Calculate fitness values.

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\mathbb{M}		\mathbb{F}	
\mathbb{M}_{n^k}	<div></div>	<div></div>	\mathbb{F}_{n^k}
	\vdots	\vdots	
\mathbb{M}_1	<div>$x_0 x_2$</div>	<div>\diamond</div>	\mathbb{F}_1
\mathbb{M}_0	<div>x_3</div>	<div></div>	\mathbb{F}_0

Review configuration sometime later.

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\mathbb{M}		\mathbb{F}	
\mathbb{M}_{n^k}			\mathbb{F}_{n^k}
\vdots		\vdots	
\mathbb{M}_1	$x_0 x_2$	$x_2 (\diamond x_4)$	\mathbb{F}_1
\mathbb{M}_0	x_5, x_3, x_1		\mathbb{F}_0

Choose a new term, say x_7 , and a female term, say $x_2(\diamond x_4)$.

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We would add $x_2((x_7 \diamond) x_4)$ to F_0 with the goal of finding $m(\vec{x})$ such that $x_2((x_7 m(\vec{x})) x_4)^G = h$.

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Is there such a term $m(\vec{x})$? If so, then $x_2((x_7 \diamond) x_4)$ must be **valid** with respect to h in the sense that

$$(\forall \vec{a} \in G^k)(\exists b \in G) : a_2((a_7 b) a_4) = h(\vec{a}),$$

namely, $b = m(\vec{a})$.

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Is there such a term $m(\vec{x})$? If so, then $x_2((x_7 \diamond) x_4)$ must be **valid** with respect to h in the sense that

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namely, $b = m(\vec{a})$.

Idempriority Theorem. *If \mathbf{G} is idempriority, then there is a term $m(\vec{x})$ such that $f(\vec{x}, m(\vec{x}))^{\mathbf{G}} = h$ if and only if $f(\vec{x}, \diamond)$ is valid with respect to h .*

If $x_2((x_7 \diamond) x_4)$ is valid, add her to \mathbb{F}_0 .

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\mathbb{M}		\mathbb{F}	
\mathbb{M}_{n^k}	<div></div>	<div></div>	\mathbb{F}_{n^k}
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\mathbb{M}_1	<div>$x_0 x_2$</div>	<div>$x_2(\diamond x_4)$</div>	\mathbb{F}_1
\mathbb{M}_0	<div>x_5, x_3, x_1</div>	<div>$x_2((x_1 \diamond) x_4)$</div>	\mathbb{F}_0

$$\begin{aligned}
 \diamond &\rightarrow x_0 \diamond \rightarrow x_0(\diamond x_3) \rightarrow x_0((\diamond x_2^2)x_3) \\
 &\rightarrow x_0((((x_4 x_1) \diamond) x_2^2) x_3) \\
 &\rightarrow x_0((((x_4 x_1)(\diamond(x_5 x_1^2)))) x_2^2) x_3) \\
 &\rightarrow x_0((((x_4 x_1)((\diamond(x_2^2 x_0^2))(x_5 x_1^2)))) x_2^2) x_3) \rightarrow \dots
 \end{aligned}$$

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A finite groupoid **G** is **term continuous** if

$$|\{f(\vec{x}, m(\vec{x}))^{\mathbf{G}} : m(\vec{x}) \text{ a term}\}| \rightarrow 1$$

as the depth of \diamond in $f(\vec{x}, \diamond) \rightarrow \infty$.

$$\begin{aligned}
\Diamond &\rightarrow x_0 \Diamond \rightarrow x_0(\Diamond x_3) \rightarrow x_0((\Diamond x_2^2)x_3) \\
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Continuity Theorem. *A finite groupoid **G** is term continuous if it is asymptotically complete and has no subgroupoid with a separating relation.*

$$\begin{aligned}
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Continuity Theorem. *A finite groupoid **G** is term continuous if it is asymptotically complete and has no subgroupoid with a separating relation. (IJAC, Vol. 23, No. 5 (2013) 1175-1205.)*

Conjecture 1. *Almost every finite groupoid is asymptotically complete.*

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Example. *Asked to find a discriminator term for the 5-element groupoid **Pi**, the Bucket Algorithm produced the following output.*

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Example. *Asked to find a discriminator term for the 5-element groupoid **Pi**, the Bucket Algorithm produced the following output.*

Length: 793 variables ($< 10^{10}$ variables)

Time: 18 minutes ($< 10^{72}$ years)

$t(x,y,z) =$

D.Clark et al.

Sample
Problem

Prior Methods

Evolutionary
Computation

The Bucket
Algorithm

Validity and
Idempriality

Continuity

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Thanks!

References

Separating
Relations



- Algebraic Terms through Simulated Biological Evolution
- D.Clark et al.
- Sample Problem
- Prior Methods
- Evolutionary Computation
- The Bucket Algorithm
- Validity and Idempriority
- Continuity
- Example
- Thanks!
- References
- Separating Relations

$$t(x,y,z) =$$
$$\begin{aligned} & zxyzy^*x^{**}yy^*xx^{**}y^*z^*yz^*yx^*y^{**}xz^*y^*z^*x^{**}yx^*z^{**}xxzx^{*****}zx^*zx^{***}z^*z^{***}y^*zx^*xyxy^{*****}y^{**}x^{***}xx^{**}zzzx \\ & *z^{***}xx^{**}z^{**}zzzx^*x^*xxzz^{**}zxy^{***}yz^*y^*xx^*y^{*****}xz^{***}z^*y^*y^{**}zx^*xz^{***}yx^{**}z^{**}zzzz^*y^*zy^{***}zz^*xz^{***}xx^{**} \\ & *z^{**}zzzx^*x^*xxzz^{**}zxy^{***}yz^*yxz^{**}zz^*x^{***}xx^*y^{*****}xz^{***}z^*y^*y^{**}zx^*xz^{***}xx^{**}z^{**}zzyy^*z^{***}z^*y^*y^*zyx^*z^{**}x \\ & x^*zz^{**}y^*x^*x^{**}yx^*y^*xz^{***}z^{**}zzzx^*x^*z^*yy^{**}xxzx^{*****}x^{***}zzzxy^*yx^*xzz^*xx^*y^{***}y^{***}xy^*x^*z^*xz^{***}xx^{**}z^{**} \\ & ****yx^*xx^*xx^{***}yyz^*zz^{***}y^{***}xz^*x^*xz^*xy^{***}x^{**}zzyz^*yz^*x^*x^*y^{**}xz^{***}z^{***}zyz^*xxz^{***}x^{***}zx^{**}zxx^*xx^*z^*yy^{***} \\ & **yz^*y^*x^*y^*yz^{***}zyx^*yz^*x^*x^*y^{**}xz^{**}z^{***}xxyy^{*****}xx^*z^{**}zzzx^*xzyyy^{**}z^{**}z^{**}y^{**}yxzxy^{*****}z^{***}xz^{**}z^{***}xy^* \\ & ****yx^*y^*yz^{***}zzx^{**}y^{***}yy^*y^*z^{**}zzxx^*xy^{***}zx^{***}xx^*yx^{**}x^*x^*yx^{**}z^{***}xx^{*****}xx^*xz^*x^*yxzy^{**}zz^*yx^{**}yy^* \\ & *xz^{*****}xy^*x^*zzxxz^{*****}yyx^*yz^*xy^*z^{**}z^{***}x^*xyxy^{***}z^*y^*xz^*y^*yx^*z^*xyxy^{***}z^*y^{***}z^*x^*zxy^{**}x^*xz^*xx^{**} \\ & x^{**}x^{***}z^*zy^{***}yy^*y^*z^*y^{**}yz^{***}yz^*yxz^*x^{**}xz^*x^{**}y^*z^{**}z^*y^{**}zyxy^{**}xyzy^{***}yz^{**}xz^*xyzy^{***}yz^{***}zyx^*x^*z^* \\ & yz^*y^*x^*zx^{*****}x^{***}z^*y^*y^{***}yxyzy^{**}zz^{**}z^{**}xxzx^{*****}xy^*xx^*x^*x^{***}xy^{***}yz^*x^*xxxy^*xx^*xzxx^*xy^{**}zz^{**}y^*y^* \\ & y^{***}z^{*****}zyx^*y^*z^{**}yxzx^*zxyy^{***}z^*yzz^{***}yxz^*zx^*xz^{***}zzz^{***}zy^*z^{*****}x^*zx^*z^{***}zzz^*yx^*y^{***}zx^*zx^{**}z^* \\ & y^*z^{**}x^*yy^*zyzyy^*yy^*x^{*****}x^*y^{**}y^{**}zzx^*x^{**}yyxz^*xy^{***}z^*zyy^*yy^*x^*x^*y^*xx^{**}xxy^{***}zz^*xx^{**}zy^*x^{*****}x^*xz^* \\ & zx^{*****}x^{***}zxxz^{**}x^{**}x^*yy^*y^*xxx^*yx^{***}zy^{**}yzyy^*x^{**}zyxx^*xy^{**}yyz^*y^{*****}x^*zyx^*y^*z^*xy^{*****}xxyy^{***}xz^*z^*y^* \\ & ****yyzxy^{***}zx^*xz^{*****}xx^*z^*z^{**}y^*yy^*y^*yz^*x^*y^*y^{***}y^*zy^*zyz^{*****}zxxzy^{***}yyx^{***}z^*xy^{*****}yxz^{***}z^*z^*zx^* \\ & zz^{*****}yx^*x^*yy^*xy^*xzyy^*zy^{***}zz^*z^*zz^*y^*z^*y^*z^*zyxy^{**}x^*zz^*z^*x^{**}zyzy^{*****}yyyz^{***}yx^*x^*y^{***}zz^*xx^*yzy^{***}zx^* \\ & *zz^{**}xyx^{*****}yx^*zzyx^*zy^{**}z^{*****}yx^*z^{*****}yx^*z^{*****}zxxz^*zx^{**}z^*zzyzy^*y^{**}xy^*y^*y^{***}y^{*****}z^{**}z^{**} \\ & x^*x^{***}zx^*xzxx^*zxx^{*****}z^{***}x^*xx^{**}zz^{*****} \end{aligned}$$

*Thanks for staying to the
end of the conference!*

— DC

References

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D.Clark et al.

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Separating
Relations

Definition. A binary relation σ on G is a **separating relation** if, for all $a, b, c \in G$,

- 1 $\sigma \neq \emptyset$,
- 2 $(a, b) \in \sigma$ implies $(b, a) \in \sigma$,
- 3 $(a, a) \notin \sigma$,
- 4 $(a, b) \in \sigma$ implies $(ac, bc) \in \sigma$ and $(ca, cb) \in \sigma$.

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For example, if \mathbf{G} is a non-trivial quasigroup, then \neq is a separating relation on \mathbf{G} .

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- 1 $\sigma \neq \emptyset$,
- 2 $(a, b) \in \sigma$ implies $(b, a) \in \sigma$,
- 3 $(a, a) \notin \sigma$,
- 4 $(a, b) \in \sigma$ implies $(ac, bc) \in \sigma$ and $(ca, cb) \in \sigma$.

For example, if \mathbf{G} is a non-trivial quasigroup, then \neq is a separating relation on \mathbf{G} .

Lemma. *If a groupoid has a separating relation, then it is not term continuous.*

Test for Separating Relations.

Test for Separating Relations.

$$\mathbf{Pi} := \langle \{0, 1, 2, 3, 4\}, * \rangle$$

Not in any separating relation.

*	0	1	2	3	4
0	1	4	1	0	4
1	2	1	0	3	0
2	3	4	2	4	3
3	2	3	3	4	1
4	2	1	4	3	3

*	0	1	2	3	4
0	x				
1		x			
2			x		
3				x	
4					x

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$$\mathbf{Pi} := \langle \{0, 1, 2, 3, 4\}, * \rangle$$

Not in any separating relation.

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0	1	4	1	0	4
1	2	1	0	3	0
2	3	4	2	4	3
3	2	3	3	4	1
4	2	1	4	3	3

*	0	1	2	3	4
0	x				
1		x			
2			x		
3				x	
4					x

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0	1	4	1	0	4
1	2	1	0	3	0
2	3	4	2	4	3
3	2	3	3	4	1
4	2	1	4	3	3

*	0	1	2	3	4
0	x				
1		x			
2			x		
3				x	x
4					x

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4	2	1	4	3	3

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0	x				
1		x			
2			x		
3				x	x
4				x	x

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3	2	3	3	4	1
4	2	1	4	3	3

*	0	1	2	3	4
0	x		x		x
1		x		x	x
2	x		x	x	x
3		x	x	x	x
4	x	x	x	x	x

Test for Separating Relations.

$\mathbf{Pi} := \langle \{0, 1, 2, 3, 4\}, * \rangle$

Not in any separating relation.

*	0	1	2	3	4
0	1	4	1	0	4
1	2	1	0	3	0
2	3	4	2	4	3
3	2	3	3	4	1
4	2	1	4	3	3

*	0	1	2	3	4
0	x	x	x	x	x
1	x	x	x	x	x
2	x	x	x	x	x
3	x	x	x	x	x
4	x	x	x	x	x

Test for Separating Relations.

$$\mathbf{Pi} := \langle \{0, 1, 2, 3, 4\}, * \rangle$$

Not in any separating relation.

*	0	1	2	3	4
0	1	4	1	0	4
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2	3	4	2	4	3
3	2	3	3	4	1
4	2	1	4	3	3

*	0	1	2	3	4
0	x	x	x	x	x
1	x	x	x	x	x
2	x	x	x	x	x
3	x	x	x	x	x
4	x	x	x	x	x

Conclusion:

Pi has no subalgebra with a separating relation.

Let $\vec{d} \in G^k$ and let $a \in G$. For $H \in \mathbb{N}$ define

$$\beta_{\vec{d},a}(H) := \text{Prob}\langle t(\vec{d}) = a \mid t \text{ is a term of height } \leq H \rangle.$$

Let $\vec{d} \in G^k$ and let $a \in G$. For $H \in \mathbb{N}$ define

$$\beta_{\vec{d},a}(H) := \text{Prob}\langle t(\vec{d}) = a \mid t \text{ is a term of height } \leq H \rangle.$$

Definition. The groupoid \mathbf{G} is **asymptotically complete** if, for each $k \in \mathbb{N}$, each $\vec{d} \in \mathbf{G}^k$ and each $a \in G$, the sequence $\beta_{\vec{d},a}$ either has constant value 0 or is eventually bounded away from 0.

Test for Asymptotic Completeness.

Test for Asymptotic Completeness.

Pi distributions with $k \in \mathbb{N}$ and $\vec{d} \in Pi^k$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1					
2					
4					
8					
6					
32					
64					
500					

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 2, 2, 2, 2)$.

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 2, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0	0	1	0	0
2	0	0	1	0	0
4	0	0	1	0	0
6	0	0	1	0	0
8	0	0	1	0	0
10	0	0	1	0	0
16	0	0	1	0	0
500	0	0	1	0	0

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

$$H \quad \beta_{\vec{d},0}(H) \quad \beta_{\vec{d},1}(H) \quad \beta_{\vec{d},2}(H) \quad \beta_{\vec{d},3}(H) \quad \beta_{\vec{d},4}(H)$$

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455
4	0.098817	0.182526	0.088076	0.368477	0.262102

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455
4	0.098817	0.182526	0.088076	0.368477	0.262102
8	0.103371	0.195561	0.091358	0.365539	0.244171

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455
4	0.098817	0.182526	0.088076	0.368477	0.262102
8	0.103371	0.195561	0.091358	0.365539	0.244171
16	0.103372	0.195275	0.091609	0.365434	0.244311

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455
4	0.098817	0.182526	0.088076	0.368477	0.262102
8	0.103371	0.195561	0.091358	0.365539	0.244171
16	0.103372	0.195275	0.091609	0.365434	0.244311
32	0.103372	0.195275	0.091609	0.365434	0.244310

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455
4	0.098817	0.182526	0.088076	0.368477	0.262102
8	0.103371	0.195561	0.091358	0.365539	0.244171
16	0.103372	0.195275	0.091609	0.365434	0.244311
32	0.103372	0.195275	0.091609	0.365434	0.244310
64	0.103372	0.195275	0.091609	0.365434	0.244310

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (3, 4, 3, 0, 2, 3, 3, 0, 1, 3)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.2	0.1	0.1	0.5	0.1
2	0.127273	0.127273	0.145455	0.254545	0.345455
4	0.098817	0.182526	0.088076	0.368477	0.262102
8	0.103371	0.195561	0.091358	0.365539	0.244171
16	0.103372	0.195275	0.091609	0.365434	0.244311
32	0.103372	0.195275	0.091609	0.365434	0.244310
64	0.103372	0.195275	0.091609	0.365434	0.244310
500	0.103372	0.195275	0.091609	0.365434	0.244310

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 2, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0	0	1	0	0
2	0	0	1	0	0
4	0	0	1	0	0
6	0	0	1	0	0
8	0	0	1	0	0
10	0	0	1	0	0
16	0	0	1	0	0
500	0	0	1	0	0

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

$$H \quad \beta_{\vec{d},0}(H) \quad \beta_{\vec{d},1}(H) \quad \beta_{\vec{d},2}(H) \quad \beta_{\vec{d},3}(H) \quad \beta_{\vec{d},4}(H)$$

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.0	0.0	0.9	0.0	0.1

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.0	0.0	0.9	0.0	0.1
2	0.000000	0.000000	0.810001	0.099999	0.090000

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.0	0.0	0.9	0.0	0.1
2	0.000000	0.000000	0.810001	0.099999	0.090000
4	0.007380	0.029583	0.430369	0.283600	0.248968

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

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1	0.0	0.0	0.9	0.0	0.1
2	0.000000	0.000000	0.810001	0.099999	0.090000
4	0.007380	0.029583	0.430369	0.283600	0.248968
8	0.095683	0.211801	0.070920	0.382629	0.238968

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.0	0.0	0.9	0.0	0.1
2	0.000000	0.000000	0.810001	0.099999	0.090000
4	0.007380	0.029583	0.430369	0.283600	0.248968
8	0.095683	0.211801	0.070920	0.382629	0.238968
16	0.103370	0.195268	0.091610	0.365436	0.244316

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.0	0.0	0.9	0.0	0.1
2	0.000000	0.000000	0.810001	0.099999	0.090000
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16	0.103370	0.195268	0.091610	0.365436	0.244316
32	0.103372	0.195275	0.091609	0.365434	0.244310

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
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32	0.103372	0.195275	0.091609	0.365434	0.244310
64	0.103372	0.195275	0.091609	0.365434	0.244310

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
1	0.0	0.0	0.9	0.0	0.1
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64	0.103372	0.195275	0.091609	0.365434	0.244310
500	0.103372	0.195275	0.091609	0.365434	0.244310

Test for Asymptotic Completeness.

Pi distributions with $k = 10$ and $\vec{d} = (2, 2, 2, 2, 2, 2, 4, 2, 2, 2)$.

H	$\beta_{\vec{d},0}(H)$	$\beta_{\vec{d},1}(H)$	$\beta_{\vec{d},2}(H)$	$\beta_{\vec{d},3}(H)$	$\beta_{\vec{d},4}(H)$
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500	0.103372	0.195275	0.091609	0.365434	0.244310

Experimental evidence that **Pi** is asymptotically complete.