

Formalization of 3-independence of simple tabulation hashing

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July 4, 2026

Abstract

Simple tabulation hashing [2] is a computationally-efficient hashing algorithm to get values that behave independently and are uniformly distributed for any 3 distinct keys. This entry formalizes the 3-independence and non-4-independence of simple tabulation hashing, based on the written proofs provided by [1, Solutions 8][4]

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```

theory Xor
imports
  Main
begin

```

This theory abstractly defines

- the binary operator *xor* (aliases (*XOR*) (\oplus))
- the n-ary version *xor-fold*
- and the Big version *xor-sum* (alias $\bigoplus_{i \in J}. f i$).

An implementation of xor should abide by the following laws:

- identity element
- commutative
- associative
- left/right neutrality
- self-inverse

which constitutes an abelian group.

Instantiations of `abel_group_xor` have been provided for `bool`, `nat` and `int`.

Other theories relating to xor:

- *abstract-boolean-algebra-sym-diff*
- *xor*
- (AFP) `Approximate_Model_Counting.RandomXOR` [3]

1 Preliminaries

1.1 The XOR operator

lemma (in *monoid-list*) *list-conv-take-drop*:
shows $F xs = F (take\ i\ xs) * F (drop\ i\ xs)$
by (*metis append append-take-drop-id*)

lemma (in *monoid-list*) *list-conv-take-nth-drop*:
assumes $i < length\ xs$
shows $F xs = F (take\ i\ xs) * xs\ !\ i * F (drop\ (Suc\ i)\ xs)$
by (*metis Cons-nth-drop-Suc append append-take-drop-id assms assoc local.Cons*)

lemma (in *comm-monoid-list*) *absorb-right*:
assumes $i < \text{length } xs$
shows $F \ xs * v = F \ (xs[i := xs ! i * v])$
by (*smt* (*verit*, *del-insts*) *append assms assoc commute list-conv-take-nth-drop*
local.Cons
upd-conv-take-nth-drop)

lemma (in *semiring-bit-operations*) *eq-iff*:
shows *semiring-bit-operations-class.xor* $a \ b = 0 \longleftrightarrow a = b$
by (*metis local.xor.assoc local.xor.left-neutral local.xor-self-eq*)

1.1.1 Definition of XOR

class *xor* =
fixes *xor* :: $\langle 'a \Rightarrow 'a \Rightarrow 'a \rangle$ (**infixr** $\langle XOR \rangle$ 59) — Definition of 2-ary xor

class *abel-group-xor* = *zero* + *xor* +
assumes *xor-commute*: $a \ XOR \ b = b \ XOR \ a$
assumes *xor-assoc*: $(a \ XOR \ b) \ XOR \ c = a \ XOR \ b \ XOR \ c$
assumes *xor-right-neutral*: $a \ XOR \ 0 = a$
assumes *eq-iff* [*iff*]: $a \ XOR \ b = 0 \longleftrightarrow a = b$
begin

lemma *self-inv* [*simp*]:
shows $a \ XOR \ a = 0$
by *simp*

The above properties show that XOR forms an abelian group

sublocale *group xor 0 id*
using *xor-commute xor-assoc* **by** *unfold-locales (simp-all add: xor-right-neutral)*

sublocale *abel-semigroup xor* **by** *unfold-locales (simp add: xor-commute)*

sublocale *comm-monoid xor 0* **by** *unfold-locales simp*

sublocale *xor-sum: comm-monoid-set xor 0*
defines *xor-sum* = *xor-sum.F* ..

abbreviation *Xor-Sum* \equiv *xor-sum* ($\lambda x. x$)

sublocale *xor-list: monoid-list xor 0*
defines *xor-fold* = *xor-list.F* .. — Definition of n-ary xor

sublocale *xor-comm-list: comm-monoid-list xor 0*
rewrites *monoid-list.F xor 0* = *xor-fold*

proof –
show *comm-monoid-list xor 0* ..
then interpret *comm-monoid-list xor 0* .
from *xor-fold-def* **show** *monoid-list.F xor 0* = *xor-fold* **by** *simp*

qed

sublocale *xor-list: comm-monoid-list-set xor 0*

rewrites *monoid-list.F xor 0 = xor-fold* **and** *comm-monoid-set.F xor 0 = xor-sum*

proof –

show *comm-monoid-list-set xor 0 ..*

then interpret *xor-sum: comm-monoid-list-set xor 0 .*

from *xor-fold-def* **show** *monoid-list.F xor 0 = xor-fold* **by** *simp*

from *xor-sum-def* **show** *comm-monoid-set.F xor 0 = xor-sum* **by** (*auto intro: sym*)

qed

lemma *xor-cong:*

assumes *a XOR b = 0*

shows *a = b*

using *assms eq-iff* **by** *blast*

lemma *inj-on-UNIV:*

shows *inj-on xor UNIV*

by (*rule inj-onI*) (*metis right-neutral*)

lemma *map-indices-conv-list-update-conv:*

shows *map (λj. if j = i then g j else xs ! j) [0..*length xs*] = xs[i := g i]*

by (*fastforce intro: nth-equalityI*)

lemma *fold-absorb:*

assumes *i < length xs*

shows *xor-fold xs XOR v =*

*xor-fold (map (λj. if j = i then xs ! j XOR v else xs ! j) [0..*length xs*])*

unfolding *map-indices-conv-list-update-conv*

using *xor-comm-list.absorb-right[OF assms]* .

end

hide-fact *xor-commute xor-assoc xor-right-neutral*

1.1.2 Standard Instantiations

instantiation *bool :: abel-group-xor* **begin**

definition *zero-bool* \equiv *False*

definition *xor-bool* $::$ *bool* \Rightarrow *bool* \Rightarrow *bool* **where** *xor-bool a b* \equiv (*a* \neq *b*)

instance **by** *standard* (*auto simp add: xor-bool-def zero-bool-def*)

end

instantiation *nat* **and** *int* $::$ *abel-group-xor* **begin**

definition *xor-nat* $::$ *nat* \Rightarrow *nat* \Rightarrow *nat* **where** *xor-nat* \equiv *semiring-bit-operations-class.xor*

definition *xor-int* $::$ *int* \Rightarrow *int* \Rightarrow *int* **where** *xor-int* \equiv *semiring-bit-operations-class.xor*

instance **by** *standard* (*simp-all add: xor-nat-def xor-int-def ac-simps semiring-bit-operations-class.eq-iff*)

end

1.1.3 Syntactic sugar

open-bundle *xor-syntax* begin

notation *xor* (infixr $\langle \oplus \rangle$ 59)

notation *Xor-Sum* ($\langle \oplus \rangle$)

Now: lots of fancy syntax. First, *xor-sum* $(\lambda x. e) A$ is written $\bigoplus_{x \in A}. e$.

syntax (ASCII)

-*xor-sum* :: *pttrn* \Rightarrow 'a set \Rightarrow 'b \Rightarrow 'b::abel-group-xor ($\langle \langle$ indent=3 notation= \langle binder
XORSUM $\rangle \rangle$ *XORSUM* (-/:-). / -) [0, 51, 10] 10)

syntax

-*xor-sum* :: *pttrn* \Rightarrow 'a set \Rightarrow 'b \Rightarrow 'b::abel-group-xor ($\langle \langle$ indent=2 notation= \langle binder
 $\oplus \rangle \rangle$ $\langle \oplus (-/\in-). / - \rangle$) [0, 51, 10] 10)

syntax-consts

-*xor-sum* \equiv *xor-sum*

translations — Beware of argument permutation!

$\bigoplus_{i \in A}. b \equiv \text{CONST } \textit{xor-sum} (\lambda i. b) A$

end

unbundle *no xor-syntax*

end

theory *Dependent-Product*

imports *HOL-Probability.Probability*

begin

The following lemma was reproduced from [3, Lemma *measure_pmf_prob_dependent_product_bound_eq*] The AFP imports `Monad_Normalisation.Monad_Normalisation` which alters some Isabelle syntax, which we want to avoid by copy pasting the lemmas here

lemma *measure-pmf-prob-dependent-product-bound-eq*:

assumes *countable* *A* \wedge *i*. *countable* (*B* *i*)

assumes $\bigwedge a. a \in A \implies \textit{measure-pmf.prob } N (B a) = r$

shows *measure-pmf.prob* (*pair-pmf* *M* *N*) (*Sigma* *A* *B*) = *measure-pmf.prob* *M*
A * *r*

(is ?*L* = ?*R*)

proof –

have ?*L* =

$(\sum_a (a, b) \in \textit{Sigma } A B. \textit{pmf } M a * \textit{pmf } N b)$

by (auto intro!: *infsetsum-cong simp add: measure-pmf-conv-infsetsum pmf-pair*)

also have $\dots = (\sum_a a \in A. \sum_b b \in B a. \textit{pmf } M a * \textit{pmf } N b)$

apply (*subst infsetsum-Sigma*)

using *assms abs-summable-on-cong*[*of* - *pmf* (*pair-pmf* *M* *N*) $\lambda u b. \textit{pmf } M$
(*fst* *u b*) * *pmf* *N* (*snd* *u b*)] *pmf-pair*[*of* *M* *N*]

```

    by (fastforce simp: case-prod-beta)+

  also have ... = (∑ a∈A. pmf M a * (measure-pmf.prob N (B a)))
  by (simp add: infsetsum-cmult-right measure-pmf-conv-infsetsum pmf-abs-summable)

  also have ... = (∑ a∈A. pmf M a * r)
  using assms(3) by fastforce

  also have ... = ?R
  by (simp add: infsetsum-cmult-left pmf-abs-summable measure-pmf-conv-infsetsum)

  finally show ?thesis .
qed

```

The following lemma was reproduced from [3, Lemma *measure_pmf_prob_dependent_product_bound_eq'*] The AFP imports `Monad_Normalisation.Monad_Normalisation` which alters some Isabelle syntax, which we want to avoid by copy pasting the lemmas here

```

lemma measure-pmf-prob-dependent-product-bound-eq':
  — N is the pmf we want to fix depending on values from M
  assumes  $\bigwedge a. a \in A \cap \text{set-pmf } M \implies \text{measure-pmf.prob } N (B a) = r$ 
  shows  $\text{measure-pmf.prob } (\text{pair-pmf } M N) (\text{Sigma } A B) = \text{measure-pmf.prob } M$ 
   $A * r$ 
  (is ?L = ?R)
proof —
  have  $\text{Sigma } A B \cap (\text{set-pmf } M \times \text{set-pmf } N) =$ 
   $\text{Sigma } (A \cap \text{set-pmf } M) (\lambda i. B i \cap \text{set-pmf } N)$ 
  by auto

  then have ?L =
   $\text{measure-pmf.prob } (\text{pair-pmf } M N) (\text{Sigma } (A \cap \text{set-pmf } M) (\lambda i. B i \cap \text{set-pmf } N))$ 
  by (metis measure-Int-set-pmf set-pair-pmf)

  also have ... =  $\text{measure-pmf.prob } M (A \cap \text{set-pmf } M) * r$ 
  by (fastforce intro: measure-pmf-prob-dependent-product-bound-eq simp: assms measure-Int-set-pmf)

  also have ... = ?R by (simp add: measure-Int-set-pmf)

  finally show ?thesis .
qed

```

```

end
theory Xor-Inst
imports
  Xor
  Fixed-Length-Vector.Fixed-Length-Vector
begin

```

More instances for *abel-group-xor*

unbundle *Fixed-Length-Vector.vec-syntax*

Sequences containing a base type that can be xor'd can itself also be xor'd, via element-wise xor

instantiation *vec* :: (*abel-group-xor,index1*) *abel-group-xor* **begin**

XORing two vectors is defined as element-wise XOR

definition *xor-vec* :: ('a, 'b) *vec* ⇒
 ('a, 'b) *vec* ⇒
 ('a, 'b) *vec* **where**
xor-vec a b ≡ *map-vec* (λ(a',b'). a' XOR b') (*zip-vec a b*)

The identity vector is a vector where every element is zero

definition *zero-vec* ≡ *replicate-vec 0* :: ('a,'b) *vec*

instance proof

fix *a b c* :: ('a, 'b) *vec*

show *eq-iff: a XOR b = 0* ↔ *a = b* **unfolding** *xor-vec-def zero-vec-def*

by (*metis* (*no-types, opaque-lifting*) *map-nth-vec replicate-nth-vec split-beta vec-cong*

abel-group-xor-class.eq-iff zip-vec-fst zip-vec-snd)

qed (*simp-all add: xor-vec-def zero-vec-def ac-simps vec-cong*)

end

lemma *nth-conv* [*simp*]:

shows (*a XOR b*) \$ *i* = *a* \$ *i* XOR *b* \$ *i*

unfolding *xor-vec-def* **by** *simp*

unbundle *no Fixed-Length-Vector.vec-syntax*

end

theory *Vec-Extras*

imports

HOL-Analysis.Finite-Cartesian-Product

Fixed-Length-Vector.Fixed-Length-Vector

begin

unbundle *no Finite-Cartesian-Product.vec-syntax*

unbundle *Fixed-Length-Vector.vec-syntax*

setup-lifting *type-definition-vec*

The most important lemmas to know when working with *Fixed-Length-Vector.vec* are

- *vec-of-list-inject*: $\llbracket x \in \{xs. \text{length } xs = \text{CARD}('b)\}; y \in \{xs. \text{length } xs = \text{CARD}('b)\} \rrbracket \implies (\text{vec-of-list } x = \text{vec-of-list } y) = (x = y)$

- *vec-of-list-inverse*: $y \in \{xs. \text{length } xs = \text{CARD}('b)\} \implies \text{list-of-vec } (\text{vec-of-list } y) = y$
- *nth-vec.rep-eq*: $(\$) x = (!) (\text{list-of-vec } x) \circ \text{from-index}$

Tip: When using *vec-of-list* to create a vector v from xs , it is essential to separately prove that $xs \in \{xs. \text{length } xs = \text{CARD}('b)\}$ for above lemmas to apply

lift-definition *vec-of-fcp* :: $('a, 'b::\{\text{finite}, \text{index1}\}) \text{Finite-Cartesian-Product.vec} \Rightarrow$

$('a, 'b) \text{Fixed-Length-Vector.vec is}$
 $\langle \lambda x. \text{map } (\lambda i. \text{Finite-Cartesian-Product.vec-nth } x \ i :: 'a) (\text{indexes} :: 'b \text{ list}) \rangle$ **by**
simp

definition *fcp-of-vec* :: $('a, 'b::\{\text{finite}, \text{index1}\}) \text{Fixed-Length-Vector.vec} \Rightarrow$

$('a, 'b) \text{Finite-Cartesian-Product.vec where}$
 $\langle \text{fcp-of-vec} \equiv \lambda x. \text{Finite-Cartesian-Product.vec-lambda } (\lambda i. x \ \$ \ i) \rangle$

lift-definition *enumerate-vec* :: $\text{nat} \Rightarrow ('a, 'b) \text{Fixed-Length-Vector.vec} \Rightarrow$

$(\text{nat} \times 'a, 'b) \text{Fixed-Length-Vector.vec is}$
 $\langle \text{List.enumerate} \rangle$ **by** *simp*

lemma *infinite-UNIV-vec*:

assumes *infinite* ($\text{UNIV} :: 'a \text{ set}$) *finite* ($\text{UNIV} :: 'b \text{ set}$)
shows *infinite* ($\text{UNIV} :: ('a, 'b) \text{Fixed-Length-Vector.vec set}$)

proof –

let $?UNIVA = \text{UNIV} :: 'a \text{ set}$
let $?UNIVB = \text{UNIV} :: 'b \text{ set}$
let $?UNIVV = \text{UNIV} :: ('a, 'b) \text{Fixed-Length-Vector.vec set}$

have $\text{CARD}('b) > 0$ **using** *assms(2)* *finite-UNIV-card-ge-0* **by** *blast*

then have $(\lambda x. \text{nth-vec}' \ x \ 0) ' ?UNIVV = ?UNIVA$
apply (*intro surjI* [**where** $?f = \lambda x. \text{replicate-vec } x$])

by (*simp add: nth-vec'.rep-eq*)

moreover have $\text{card } ((\lambda x. \text{nth-vec}' \ x \ 0) ' ?UNIVV) \leq \text{card } ?UNIVV$

by (*simp add: calculation assms*)

ultimately show $?thesis$ **by** (*metis assms finite-imageI*)

qed

lemma *infinite-index-UNIV-vec*:

assumes *infinite* ($\text{UNIV} :: 'b \text{ set}$)

shows $(\text{UNIV} :: ('a, 'b) \text{Fixed-Length-Vector.vec set}) = \{\text{vec-of-list } []\}$

by (*metis (mono-tags, lifting) UNIV-eq-I assms card.infinite insertI1 length-0-conv list-of-vec-inverse list-of-vec-length*)

lemma *card-UNIV-vec*:

shows $\text{CARD}(('a, 'b) \text{Fixed-Length-Vector.vec}) = \text{CARD}('a) \wedge \text{CARD}('b)$ (**is**
 $?lhs = ?rhs$)

```

proof –
  let ?UNIVA = UNIV :: 'a set
  let ?UNIVB = UNIV :: 'b set
  let ?UNIVV = UNIV :: ('a,'b) Fixed-Length-Vector.vec set

  consider finite ?UNIVA | infinite ?UNIVA finite ?UNIVB | infinite ?UNIVA
  infinite ?UNIVB
    by fast
  then show ?thesis
  proof cases
    case 1
      have ?lhs = card ({xs. length xs = CARD('b)} :: 'a list set)
      using Fixed-Length-Vector.vec.type-definition-vec type-definition.card by blast
      also have ... = ?rhs using card-lists-length-eq[of ?UNIVA, OF 1] by simp
      finally show ?thesis .
    next
      case 2
      have infinite ?UNIVV using infinite-UNIV-vec[OF 2] .
      then show ?thesis using 2 finite-UNIV-card-ge-0 by (simp add: card-eq-0-iff)
    next
      case 3
      have card ?UNIVV = Suc 0 unfolding infinite-index-UNIV-vec[OF 3(2)] by
  simp
      then show ?thesis using 3 by (simp add: card-eq-0-iff)
  qed
qed

```

```

lemma (in index1) from-index-neq [simp]:
  assumes a ≠ b
  shows from-index a ≠ from-index b
  by (metis assms local.from-to-index)

```

```

lemma list-of-vec-not-empty [simp]:
  fixes xs :: ('a, 'b :: index1) Fixed-Length-Vector.vec
  shows list-of-vec xs ≠ []
  by (metis from-index-bound gr-implies-not0 list.size(3) list-of-vec-length)

```

```

lemma id-take-nth-drop-vec:
  fixes xs :: ('a, 'b :: index1) Fixed-Length-Vector.vec
  assumes i < CARD('b)
  shows
    xs = vec-of-list (
      take i (list-of-vec xs) @
      list-of-vec xs ! i #
      drop (Suc i) (list-of-vec xs))
  by (simp add: Cons-nth-drop-Suc assms)

```

lemma *id-take-nth-drop-vec'*:
fixes $xs :: ('a, 'b :: index1) \text{Fixed-Length-Vector.vec}$
assumes $i < \text{CARD}('b)$
shows
 $xs = \text{vec-of-list} ($
 $\quad \text{take } i (\text{list-of-vec } xs) @$
 $\quad xs \$ \text{to-index } i \#$
 $\quad \text{drop } (\text{Suc } i) (\text{list-of-vec } xs))$
by (*simp add: Cons-nth-drop-Suc assms nth-vec.rep-eq to-from-index*)

lemma *nth-not-mem-enumerate*:
assumes $y ! i \neq x ! i$
shows $(i, y ! i) \notin \text{set } (\text{List.enumerate } 0 x)$
apply (*subst in-set-conv-nth, clarsimp*)
using *assms nth-enumerate-eq by fastforce*

lemma *nth-not-mem-enumerate-take*:
assumes $y ! j \neq x ! j$
shows $(j, y ! j) \notin \text{set } (\text{List.enumerate } 0 (\text{take } i x))$
apply (*subst in-set-conv-nth, clarsimp*)
by (*metis arith-simps(49) assms length-take min-less-iff-conj nth-enumerate-eq nth-take prod.sel(1,2)*)

lemma *nth-not-mem-enumerate-drop*:
assumes $y ! j \neq x ! j$
shows $(j, y ! j) \notin \text{set } (\text{List.enumerate } (\text{Suc } i) (\text{drop } (\text{Suc } i) x))$
apply (*subst in-set-conv-nth, clarsimp*)
by (*metis assms fst-eqD length-drop linorder-not-le nat-diff-split not-less-zero nth-drop nth-enumerate-eq snd-eqD*)

lemma *nth-enumerate-eq-vec*:
fixes $xs :: ('a, 'b :: index1) \text{Fixed-Length-Vector.vec}$
assumes $m < \text{CARD}('b)$
shows $\text{enumerate-vec } n xs \$ \text{to-index } m = (n + m, xs \$ \text{to-index } m)$
by (*simp add: nth-vec.rep-eq index.to-from-index index-axioms assms enumerate-vec.rep-eq nth-enumerate-eq*)

lemma *in-set-enumerate-eq-vec*:
fixes $xs :: ('a, 'b :: index1) \text{Fixed-Length-Vector.vec}$
shows $p \in \text{set-vec } (\text{enumerate-vec } n xs) \iff$
 $n \leq \text{fst } p \wedge \text{fst } p < \text{CARD}('b) + n \wedge xs \$ \text{to-index } (\text{fst } p - n) = \text{snd } p$
apply (*simp add:*
 $\quad \text{in-set-enumerate-eq nth-vec.rep-eq set-vec.rep-eq index.to-from-index}$
 $\quad \text{index-axioms enumerate-vec.rep-eq nth-enumerate-eq}$)
by (*metis less-diff-conv2 to-from-index*)

lemma *inj-vec-of-fcp*:
shows *inj vec-of-fcp*
apply (*clarsimp*
intro! *injI*
simp: vec-of-fcp-def vec-of-list-inject indexes-def vec-eq-iff Ball-def)
by (*metis from-to-index from-index-bound*)

lemma *inj-fcp-of-vec*:
shows *inj fcp-of-vec*
by (*auto intro!* *injI vec-cong simp: fcp-of-vec-def*)

lemma *fcp-of-vec-inverse*:
shows *vec-of-fcp (fcp-of-vec x) = x*
apply (*simp add: vec-of-fcp-def fcp-of-vec-def*)
by (*metis UNIV-I vec-explode vec-lambda.abs-eq vec-lambda-inverse*)

lemma *vec-of-fcp-inverse*:
shows *fcp-of-vec (vec-of-fcp x) = x*
apply (*simp add: vec-of-fcp-def fcp-of-vec-def*)
by (*metis vec-lambda.abs-eq vec-lambda-nth vec-lambda-unique*)

lemma *surj-vec-of-fcp*:
shows *surj vec-of-fcp*
using *fcp-of-vec-inverse* **by** (*intro surjI*)

lemma *surj-fcp-of-vec*:
shows *surj fcp-of-vec*
using *vec-of-fcp-inverse* **by** (*intro surjI*)

lemma *bij-vec-of-fcp*:
shows *bij vec-of-fcp*
by (*intro bijI inj-vec-of-fcp surj-vec-of-fcp*)

lemma *bij-fcp-of-vec*:
shows *bij fcp-of-vec*
by (*intro bijI inj-fcp-of-vec surj-fcp-of-vec*)

unbundle *no Fixed-Length-Vector.vec-syntax*
end

theory *Simple-Tabulation-Hashing*

imports

Universal-Hash-Families. Universal-Hash-Families-More-Product-PMF

Dependent-Product

Xor-Inst

Vec-Extras

begin

unbundle *Xor.xor-syntax*

unbundle *Fixed-Length-Vector.vec-syntax*
unbundle *no Finite-Cartesian-Product.vec-syntax*
hide-type *Finite-Cartesian-Product.vec*

1.2 Intro rules, contrapositives and bijections

lemma (in *prob-space*) *k-wise-indep-varsI*:
assumes $\bigwedge a J. \llbracket J \subseteq I; \text{card } J \leq k; \text{finite } J \rrbracket \implies$
 $\text{prob } \{\omega. \forall i \in J. X \ i \ \omega = a \ i\} = (\prod i \in J. \text{prob } \{\omega. X \ i \ \omega = a \ i\})$
 $M = \text{measure-pmf } p$
shows *k-wise-indep-vars k* ($\lambda.$ *count-space UNIV*) *X I*
apply (*simp only: k-wise-indep-vars-def prob-space-axioms*)
apply (*clarsimp, rule indep-vars-pmf, rule assms(2)*)
by (*metis (no-types, lifting) assms(1) card-mono order-trans-rules(23)*)

lemma (in *prob-space*) *indep-vars-pmf-contrapos*:
assumes $\text{prob } \{\omega. \forall x \in J. P \ x \ (X' \ x \ \omega)\} \neq (\prod x \in J. \text{prob } \{\omega. P \ x \ (X' \ x \ \omega)\})$
 $\text{finite } J \ M = \text{measure-pmf } p$
shows $\neg \text{indep-vars } (\lambda.$ *count-space UNIV*) *X' J*
apply (*rule contrapos-nn[OF assms(1)]*)
using *assms* **by** (*intro split-indep-events; force*)

locale *bij-betw-funcsetE* **begin**

These lemmas prove bijections between sets of 2-arity functions and their decompositions

For example, a function $f : [0, 100] \rightarrow \{A, B, C\} \rightarrow \{True, False\}$ can be decomposed into 3 parts:

$$\begin{aligned} & \rightarrow \{A, B, C\} \rightarrow \{True, False\} \\ \equiv & [1, 100] \rightarrow \{A, B, C\} \rightarrow \{True, False\} \times \\ & \{A, C\} \rightarrow \{True, False\} \times \\ & \{True, False\} \end{aligned}$$

- *base*: $[1, 100] \rightarrow \{A, B, C\} \rightarrow \{True, False\}$ (split the 0-index, leaving 1-100 intact)
- z_0 : $\{A, C\} \rightarrow \{True, False\}$ (represents the 0-index, but further split the B-index)
- z_b : $B \in \{True, False\}$ (decides the value for $f \ 0 \ B$)

f is equivalent to its reconstruction, $f = \text{base}(0 := z_0(B := z_b))$

context
fixes α **and** $A \ B :: - \ \text{set}$
assumes $\alpha \text{-in-} A: \alpha \in A$
begin

```

lemma bij-PiE-remove-point:
  bij-betw ( $\lambda (f, v). f(\alpha := v)$ ) ( $(A - \{\alpha\} \rightarrow_E B) \times B$ ) ( $A \rightarrow_E B$ )
proof (intro bij-betw-imageI inj-onI, goal-cases inj surj)
  case (inj -)
  then show ?case
    apply (simp add: case-prod-beta' image-iff prod-eq-iff set-eq-iff mem-Times-iff
fun-eq-iff)
    by (metis Diff-iff PiE-arb insertCI)
next
  case surj
  then show ?case
proof (intro equalityI subsetI)
  fix h assume  $h \in A \rightarrow_E B$ 
  with  $\alpha$ -in-A have  $h \alpha \in B$   $h(\alpha := \text{undefined}) \in A - \{\alpha\} \rightarrow_E B$ 
  by (auto simp: PiE-def extensional-def)
  then show  $h \in (\lambda (f, v). f(\alpha := v)) \text{ ' } ((A - \{\alpha\} \rightarrow_E B) \times B)$ 
  apply (simp add: case-prod-beta' image-iff)
  by (metis fun-upd-upd fun-upd-triv)
next
  fix h assume  $h \in (\lambda(f, v). f(\alpha := v)) \text{ ' } ((A - \{\alpha\} \rightarrow_E B) \times B)$ 
  with  $\alpha$ -in-A show  $h \in A \rightarrow_E B$ 
  apply (simp add: case-prod-beta' image-iff)
  by (metis insert-Diff PiE-fun-upd)
qed
qed

```

Helper: "Absorb" a point into a function space bijection. This allows chaining: if we have a bijection F for a smaller domain $S \rightarrow (A - \{x\} \rightarrow B)$, we can automatically get a bijection for $S \times B \rightarrow (A \rightarrow B)$.

```

lemma bij-absorb-point:
  assumes bij-betw  $F S (A - \{\alpha\} \rightarrow_E B)$ 
  shows bij-betw ( $\lambda (s, v). (F s)(\alpha := v)$ ) ( $S \times B$ ) ( $A \rightarrow_E B$ )
proof -
  - 1. Combine  $F$  with Identity on  $B$ 
  from assms have bij-betw (map-prod  $F$  id) ( $S \times B$ ) ( $(A - \{\alpha\} \rightarrow_E B) \times B$ )
  by (blast intro: bij-betw-map-prod)
  - 2. Apply the base removal lemma
  with bij-PiE-remove-point show ?thesis
  by (auto
    elim: bij-betw-trans[simplified comp-def, elim-format]
    simp: map-prod-def case-prod-beta')
qed

```

Helper 2: "Lift Value" Attaches a computed value V to the function at point x . Used for the outer function (e.g., $a(\alpha := V)$).

```

lemma bij-lift-value:
  assumes bij-betw  $V S B$ 
  shows bij-betw ( $\lambda(f, s). f(\alpha := V s)$ ) ( $(A - \{\alpha\} \rightarrow_E B) \times S$ ) ( $A \rightarrow_E B$ )

```

proof –
have *bij-betw* (*map-prod id V*) ((*A* – { α } →_{*E*} *B*) × *S*) ((*A* – { α } →_{*E*} *B*) × *B*)
using *assms* **by** (*simp add: bij-betw-map-prod*)
with *bij-PiE-remove-point* **show** ?*thesis*
by (*auto*
elim: bij-betw-trans[simplified comp-def, elim-format]
simp: map-prod-def case-prod-beta')

qed

end

Tuple Association Helper: $((A, B), C) \longleftrightarrow (A, B, C)$

lemma *bij-assoc-right-to-left*:
bij-betw ($\lambda (a, b, c). ((a, b), c)$) (*A* × *B* × *C*) ((*A* × *B*) × *C*)
by (*auto intro: bij-betwI[where g= $\lambda (a, b), c). (a, b, c)$]*)

lemma *bij-assoc-left-to-right*:
bij-betw ($\lambda ((a, b), c). (a, b, c)$) ((*A* × *B*) × *C*) (*A* × *B* × *C*)
by (*auto intro: bij-betwI[where g= $\lambda (a, b), c). ((a, b), c)$]*)

lemma *bij-betw-combine-right*:
assumes *bij-betw f B C*
shows *bij-betw* ($\lambda (a, b). (a, f b)$) (*A* × *B*) (*A* × *C*)
using *assms* **by** (*simp flip: map-prod-def id-def add: case-prod-beta' bij-betw-map-prod*)

1.2.1 Application

lemma *remove1-remove1*:
assumes $\alpha \in A \beta \in B$ *finite A finite B finite C C* ≠ {}
shows *bij-betw*
 $(\lambda (a, b, c). a(\alpha := b(\beta := c)))$
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times (B - \{\beta\} \rightarrow_E C) \times C)$
 $(A \rightarrow_E B \rightarrow_E C)$

proof –

– 1. Establish bijection for the value: $b(\beta := c)$

have *bij-val: bij-betw* ($\lambda (b, c). b(\beta := c)$) ((*B* – { β } →_{*E*} *C*) × *C*) (*B* →_{*E*} *C*)
using *bij-PiE-remove-point[OF $\langle \beta \in B \rangle$]* **by** *auto*

– 2. Lift this value to *A*

have *bij-lift: bij-betw* ($\lambda (a, (b, c)). a(\alpha := b(\beta := c))$)
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ((B - \{\beta\} \rightarrow_E C) \times C))$
 $(A \rightarrow_E B \rightarrow_E C)$
using *bij-lift-value[OF $\langle \alpha \in A \rangle$ bij-val]* **by** (*auto simp: case-prod-beta'*)

– 3. Fix tuple associativity $(a, b, c) \rightarrow (a, (b, c))$

have *bij-assoc: bij-betw* ($\lambda (a, b, c). (a, (b, c))$)
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times (B - \{\beta\} \rightarrow_E C) \times C)$
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ((B - \{\beta\} \rightarrow_E C) \times C))$
by (*simp add: bij-betwI[where g= $\lambda (a, (b, c)). (a, b, c)$]*)

show *?thesis*
using *bij-betw-trans[OF bij-assoc bij-lift]* **by** (*simp add: case-prod-beta*)
qed

lemma *remove1-remove2*:

assumes $\beta 1 \neq \beta 2$ $\alpha \in A$ $\beta 1 \in B$ $\beta 2 \in B$
 $finite\ A\ finite\ B\ finite\ C\ C \neq \{\}$

shows *bij-betw*

$(\lambda(a,b,c,d). a(\alpha := b(\beta 1 := c, \beta 2 := d)))$
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times (B - \{\beta 1, \beta 2\} \rightarrow_E C) \times C \times C)$
 $(A \rightarrow_E B \rightarrow_E C)$

proof –

let $?S\text{-}B = (B - \{\beta 1, \beta 2\} \rightarrow_E C) \times C \times C$

– 1. Build bijection for value: $b(\beta 1 := c, \beta 2 := d)$
– We use *bij-absorb-point* recursively

have $\beta 1 \in B - \{\beta 2\}$ **using** *assms* **by** *simp*

– Start with *remove_point* for $\beta 1$

have *bij-B-start*: *bij-betw* $(\lambda(b, c). b(\beta 1 := c))$

$((B - \{\beta 1, \beta 2\} \rightarrow_E C) \times C) (B - \{\beta 2\} \rightarrow_E C)$

using *bij-PiE-remove-point[OF ‹ $\beta 1 \in B - \{\beta 2\}$ ›]* **by** (*metis Diff-insert*)

– Absorb $\beta 2$

have *bij-B-next*: *bij-betw* $(\lambda((b, c), d). b(\beta 1 := c, \beta 2 := d))$

$((B - \{\beta 1, \beta 2\} \rightarrow_E C) \times C) \times C (B \rightarrow_E C)$

using *bij-absorb-point[OF ‹ $\beta 2 \in B$ › bij-B-start]* **by** (*simp add: case-prod-beta'*)

– Flatten tuple for B

have *bij-B-val*: *bij-betw* $(\lambda(b,c,d). b(\beta 1 := c, \beta 2 := d))$ $?S\text{-}B (B \rightarrow_E C)$

using *bij-betw-trans[OF bij-assoc-right-to-left bij-B-next]*

by (*simp add: case-prod-beta' comp-def*)

– 2. Lift to A

have *bij-lift*: *bij-betw* $(\lambda(a, (b,c,d)). a(\alpha := b(\beta 1 := c, \beta 2 := d)))$

$((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ?S\text{-}B) (A \rightarrow_E B \rightarrow_E C)$

using *bij-lift-value[OF ‹ $\alpha \in A$ › bij-B-val]* **by** (*simp add: case-prod-beta' comp-def*)

– 3. Fix tuple associativity

have *bij-assoc*: *bij-betw* $(\lambda(a,b,c,d). (a,(b,c,d)))$

$((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ?S\text{-}B)$

$((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ?S\text{-}B)$

by (*simp add: bij-betwI [where $g=\lambda(a, (b,c,d)). (a,b,c,d)$]*)

show *?thesis*

using *bij-betw-trans[OF bij-assoc bij-lift]* **by** (*simp add: case-prod-beta*)

qed

lemma *remove1-remove3*:

assumes $\beta 1 \neq \beta 2$ $\beta 2 \neq \beta 3$ $\beta 3 \neq \beta 1$ $\alpha \in A$ $\beta 1 \in B$ $\beta 2 \in B$ $\beta 3 \in B$
finite A finite B finite C C $\neq \{\}$

shows *bij-betw*

$(\lambda(a,b,c,d,e). a(\alpha := b(\beta 1 := c, \beta 2 := d, \beta 3 := e)))$
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times (B - \{\beta 1, \beta 2, \beta 3\} \rightarrow_E C) \times C \times C \times C)$
 $(A \rightarrow_E B \rightarrow_E C)$

proof –

let $?DomB3 = B - \{\beta 1, \beta 2, \beta 3\} \rightarrow_E C$

let $?S-B = ?DomB3 \times C \times C \times C$

– 1. Build bijection for value B recursively

– Step 1: Base $\beta 1$

from *assms bij-PiE-remove-point[of $\beta 1 B - \{\beta 3, \beta 2\}$]*
have *bij-betw* $(\lambda(b,c). b(\beta 1 := c))$ $(?DomB3 \times C) (B - \{\beta 3, \beta 2\} \rightarrow_E C)$
by *(auto simp flip: Diff-insert simp: insert-commute)*

– Step 2: Absorb $\beta 2$

with *assms bij-absorb-point[of $\beta 2 B - \{\beta 3\}$]*
have *bij-betw* $(\lambda((b,c),d). b(\beta 1 := c, \beta 2 := d))$ $((?DomB3 \times C) \times C) (B - \{\beta 3\} \rightarrow_E C)$
by *(auto simp flip: Diff-insert simp: case-prod-beta' insert-commute)*

– Step 3: Absorb $\beta 3$

with *assms bij-absorb-point[of $\beta 3 B$]*
have *bij-3: bij-betw* $(\lambda(((b,c),d),e). b(\beta 1 := c, \beta 2 := d, \beta 3 := e))$ $(((?DomB3 \times C) \times C) \times C) (B \rightarrow_E C)$
by *(auto simp: case-prod-beta' insert-commute)*

moreover have *bij-betw* $(\lambda(b,c,d,e). (((b,c),d),e))$ $?S-B$ $((?DomB3 \times C) \times C) \times C)$
by *(auto intro: bij-betwI[where $g = \lambda(((b,c),d),e). (b,c,d,e)$])*

– Step 4: Flatten tuple for B

ultimately have *bij-betw* $(\lambda(b,c,d,e). b(\beta 1 := c, \beta 2 := d, \beta 3 := e))$ $?S-B (B \rightarrow_E C)$
by *(auto*
elim: bij-betw-trans[simplified comp-def, elim-format]
simp: case-prod-beta')

– 2. Lift to A

with *bij-lift-value assms*
have *bij-lift: bij-betw* $(\lambda(a, (b,c,d,e)). a(\alpha := b(\beta 1 := c, \beta 2 := d, \beta 3 := e)))$
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ?S-B) (A \rightarrow_E B \rightarrow_E C)$
by *(simp add: case-prod-beta')*

– 3. Fix tuple associativity

have *bij-assoc: bij-betw* $(\lambda(a,b,c,d,e). (a,(b,c,d,e)))$

$((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ?S-B)$
 $((A - \{\alpha\} \rightarrow_E B \rightarrow_E C) \times ?S-B)$

by (*auto intro: bij-betwI* [**where** $g = \lambda(a, (b, c, d, e)). (a, b, c, d, e)$])

with *bij-betw-trans*[*OF* *bij-assoc* *bij-lift*] **show** *?thesis*
by (*simp add: case-prod-beta*)

qed

lemma *remove2-remove2'remove1*:
assumes $\alpha 1 \neq \alpha 2$ $\beta 1 \neq \beta 2$ $\alpha 1 \in A$ $\alpha 2 \in A$ $\beta 1 \in B$ $\beta 2 \in B$ $\beta 3 \in B$
finite A finite B finite C C ≠ {}
shows *bij-betw*
 $(\lambda(a, b, c, d, e, f). a(\alpha 1 := b(\beta 1 := d, \beta 2 := e), \alpha 2 := c(\beta 3 := f)))$
 $((A - \{\alpha 1, \alpha 2\} \rightarrow_E B \rightarrow_E C) \times (B - \{\beta 1, \beta 2\} \rightarrow_E C) \times (B - \{\beta 3\} \rightarrow_E C) \times C \times C \times C)$
 $(A \rightarrow_E B \rightarrow_E C)$

proof –
let $?DomA = A - \{\alpha 1, \alpha 2\} \rightarrow_E B \rightarrow_E C$
let $?DomB1 = B - \{\beta 1, \beta 2\} \rightarrow_E C$
let $?DomB2 = B - \{\beta 3\} \rightarrow_E C$

have *bij-betw* $(\lambda(b, d, e). ((b, d), e))$ $(?DomB1 \times C \times C)$ $((?DomB1 \times C) \times C)$
by (*auto intro: bij-betwI* [**where** $g = \lambda((b, d), e). (b, d, e)$])

moreover from *assms* *bij-absorb-point*[*of* $\beta 2$ *B*] *bij-PiE-remove-point*[*of* $\beta 1$ *B* – $\{\beta 2\}$]
have *bij-betw* $(\lambda((b, d), e). b(\beta 1 := d, \beta 2 := e))$ $((?DomB1 \times C) \times C)$ $(B \rightarrow_E C)$
by (*auto simp flip: Diff-insert simp: case-prod-beta'*)

– 1. Val 1: $b(\beta 1 := d, \beta 2 := e)$
ultimately have *bij-betw* $(\lambda(b, d, e). b(\beta 1 := d, \beta 2 := e))$ $(?DomB1 \times C \times C)$ $(B \rightarrow_E C)$
by (*auto elim: bij-betw-trans*[*simplified comp-def, elim-format*] *simp: case-prod-beta'*)

– 2. Val 2: $c(\beta 3 := f)$
moreover from *bij-PiE-remove-point*[*of* $\beta 3$ *B*] *assms*
have *bij-betw* $(\lambda(c, f). c(\beta 3 := f))$ $(?DomB2 \times C)$ $(B \rightarrow_E C)$ **by** *auto*

– 3. Combine values (Product Step)
– We explicitly form the tuple structure $((B1, C, C), (B2, C))$
ultimately have *bij-vals: bij-betw*
 $(\lambda((b, d, e), (c, f)). (b(\beta 1 := d, \beta 2 := e), c(\beta 3 := f)))$
 $((?DomB1 \times C \times C) \times (?DomB2 \times C))$
 $((B \rightarrow_E C) \times (B \rightarrow_E C))$
by (*fastforce dest: bij-betw-map-prod simp add: map-prod-def id-def case-prod-beta'*)

– 4. Lift to Parallel
from *bij-betw-map-prod*[*OF* *bij-betw-id* *bij-vals*] **have** *bij-parallel:*
bij-betw

$(\lambda(a, rest). (a, (\lambda((b,d,e), (c,f)). (b(\beta1:=d, \beta2:=e), c(\beta3:=f)))) rest))$
 $(?DomA \times ((?DomB1 \times C \times C) \times (?DomB2 \times C)))$
 $(?DomA \times ((B \rightarrow_E C) \times (B \rightarrow_E C)))$
by (*auto simp: map-prod-def id-def case-prod-beta'*)

have *bij-A-step1*: *bij-betw* $(\lambda((a, v1), v2). (a(\alpha1 := v1), v2))$
 $((?DomA \times (B \rightarrow_E C)) \times (B \rightarrow_E C)) ((A - \{\alpha2\} \rightarrow_E B \rightarrow_E C)$
 $\times (B \rightarrow_E C))$
using *assms bij-lift-value*[*of* $\alpha1 A - \{\alpha2\}$]
by (*force*
intro: bij-betw-map-prod simp flip: map-prod-def id-def Diff-insert
simp: case-prod-beta')

have *bij-A-step2*: *bij-betw* $(\lambda(a, v2). a(\alpha2 := v2))$
 $((A - \{\alpha2\} \rightarrow_E B \rightarrow_E C) \times (B \rightarrow_E C)) (A \rightarrow_E B \rightarrow_E C)$
using *assms bij-PIE-remove-point*[*of* $\alpha2 A$] **by** (*auto simp: case-prod-beta'*)

— 5. Explicit Shuffle

have *bij-shuffle*: *bij-betw* $(\lambda(a, b, c, d, e, f). (a, (b, d, e), (c, f)))$
 $(?DomA \times ?DomB1 \times ?DomB2 \times C \times C \times C)$
 $(?DomA \times (?DomB1 \times C \times C) \times (?DomB2 \times C))$
by (*auto intro: bij-betwI*[**where** $g=\lambda(a, (b, d, e), (c, f)). (a, b, c, d, e, f)$])

— 6. Final Chain - broken into steps to avoid unification issues

have *bij-betw* $(\lambda(a, (b,d,e), (c,f)). ((a, b(\beta1:=d, \beta2:=e)), c(\beta3:=f)))$
 $(?DomA \times (?DomB1 \times C \times C) \times (?DomB2 \times C))$
 $((?DomA \times (B \rightarrow_E C)) \times (B \rightarrow_E C))$
proof –
have *bij-betw* $(\lambda(a, v1, v2). ((a, v1), v2))$
 $(?DomA \times (B \rightarrow_E C) \times (B \rightarrow_E C)) ((?DomA \times (B \rightarrow_E C)) \times (B \rightarrow_E C))$
by (*rule bij-betwI* [**where** $g=\lambda((a,v1),v2). (a,v1,v2)$]) *auto*
with *bij-parallel show ?thesis*
by (*auto elim: bij-betw-trans*[*simplified comp-def, elim-format*] *simp: case-prod-beta'*)
qed

with *bij-shuffle* **have**
bij-betw $(\lambda(a, b, c, d, e, f). ((a, b(\beta1:=d, \beta2:=e)), c(\beta3:=f)))$
 $(?DomA \times ?DomB1 \times ?DomB2 \times C \times C \times C)$
 $((?DomA \times (B \rightarrow_E C)) \times (B \rightarrow_E C))$
by (*auto elim: bij-betw-trans*[*simplified comp-def, elim-format*] *simp: case-prod-beta'*)

moreover from *bij-A-step1* *bij-A-step2* **have**
bij-betw $(\lambda((a, v1), v2). a(\alpha1 := v1, \alpha2 := v2))$
 $((?DomA \times (B \rightarrow_E C)) \times (B \rightarrow_E C))$
 $(A \rightarrow_E B \rightarrow_E C)$
by (*auto elim: bij-betw-trans*[*simplified comp-def, elim-format*] *simp: case-prod-beta'*)

ultimately show *?thesis*

by (auto elim: bij-betw-trans[simplified comp-def, elim-format] simp: case-prod-beta')
qed

end

2 Definitions

locale *simple-tabulation-hashing* =
fixes $n :: 'n :: \{index1, zero\}$ *itself* — key length, i.e. 4 for 4 'fragments
fixes $r :: 'result :: \{abel-group-xor, finite\}$ *itself* — bool or any type that supports
xor
fixes $q :: 'q :: index1$ *itself* — digest length, i.e. 3
fixes $d :: 'fragment :: finite$ *itself* — domain of input key fragments
assumes $n = TYPE('n)$
begin

In tabulation hashing, keys are split into n fragments, each piece hashed individually, before being combined into a final digest with the XOR operator. i.e. $x \equiv [x_0, x_1, x_2]$, $h(x) \equiv h_0x_0 \oplus h_1x_1 \oplus h_2x_2$

Therefore, the type variable 'n, $CARD('n)$ and n must reflect the number of parts in a key. In the example above, 'n = 3 (which is an alias for num1 bit1)

The final digest length is indicated by the type variable 'q, and 'result is any type that supports xor. For example, 'result = bool. When using 'result = bool and 'q = 3, it can be interpreted as using a 3-bit word as the output, which can encode $2^3 = 8$ possibilities, e.g. [True, False, True]

abbreviation $cardn :: 'n$ *itself* \Rightarrow *nat* **where** $cardn - \equiv CARD('n)$

abbreviation $N :: 'n$ *itself* \Rightarrow *nat set* **where** N *type* $\equiv \{..<cardn$ *type* $\}$

abbreviation $D :: 'fragment$ *set* **where** $D \equiv UNIV$

abbreviation $Dn :: ('fragment, 'n)$ *vec set* $(\langle D^n \rangle)$ **where**
— domain of all possible input keys s.t. each key is composed of exactly $*n*$ fragments
 $D^n \equiv UNIV$

abbreviation $R :: ('result, 'q)$ *vec set* **where**
— range of all possible outputs, s.t. each output is composed of exactly $*q*$ bits
 $R \equiv UNIV$

abbreviation $H :: 'n$ *itself* \Rightarrow $(nat \Rightarrow 'fragment \Rightarrow ('result, 'q)$ *vec*) *set* **where**
— set of all possible assignments and combinations for every column-item pair
 H *type* $\equiv N$ *type* $\rightarrow_E D \rightarrow_E R$

definition $tb-S :: 'n$ *itself* \Rightarrow $(nat \Rightarrow 'fragment \Rightarrow ('result, 'q)$ *vec*) *pmf* **where**
— Generator of instances of H

$tb-S \equiv pmf-of-set (H n)$

definition $tb-H :: ('fragment, 'n) vec \Rightarrow (nat \Rightarrow 'fragment \Rightarrow ('result, 'q) vec) \Rightarrow ('result, 'q) vec$ **where**

— Applies the tabulation hashing algorithm on *k* using a hash function from H
 $tb-H k h \equiv xor-fold (map (\lambda i. h i (k \$ to-index i))) ([0..<cardn n])$

lemma $tb-S-alt-def$:

shows $tb-S n = prod-pmf (N n) (\lambda-. prod-pmf UNIV (\lambda-. pmf-of-set R))$

unfolding $tb-S-def$

by ($simp$ $add: Pi-pmf-of-set PiE-default-undefined-eq$)

lemma $tb-H-absorb$:

assumes $i < CARD('n)$

shows $tb-H x h \oplus c = tb-H x (h(i := (h i)(x \$ to-index i := h i (x \$ to-index i) \oplus c)))$

unfolding $tb-H-def$

by ($auto$ $intro!$: $arg-cong$ [**where** $f = xor-fold$] $simp: fold-absorb[of i] assms$)

lemma $tb-H-absorb'$:

shows $tb-H x h \oplus c =$

$tb-H x (h(from-index i := (h (from-index i))(x \$ i := h (from-index i) (x \$ i) \oplus c)))$

by ($metis$ $from-index-bound$ $from-to-index$ $tb-H-absorb$)

lemma $tb-H-extract$:

assumes $i < CARD('n)$

shows $tb-H x (h(i := g(x \$ to-index i := \alpha))) = tb-H x (h(i := g(x \$ to-index i := 0))) \oplus \alpha$

by ($subst$ $tb-H-absorb[OF assms]$) $simp$

lemma $tb-H-extract'$:

shows $tb-H x (h(from-index i := g(x \$ i := \alpha))) = tb-H x (h(from-index i := g(x \$ i := 0))) \oplus \alpha$

by ($metis$ $from-index-bound$ $from-to-index$ $tb-H-extract$)

lemma $tb-H-exch$:

assumes $i < CARD('n)$

shows $tb-H x (a(i := aa(x \$ to-index i := b))) = \alpha \longleftrightarrow$

$b = tb-H x (a(i := aa(x \$ to-index i := \alpha)))$

apply ($subst$ (1 2) $tb-H-extract[OF assms]$)

by ($metis$ ($no-types$, $lifting$) $assoc$ $abel-group-xor-class.eq-iff$)

lemma $tb-H-exch'$:

shows $tb-H x (a(from-index i := aa(x \$ i := b))) = \alpha \longleftrightarrow$

$b = tb-H x (a(from-index i := aa(x \$ i := \alpha)))$

by ($metis$ $from-index-bound$ $from-to-index$ $tb-H-exch$)

lemma $tb-H-discard$:

assumes $x \$ i \neq y \$ i$
shows $tb-H x (a(\text{from-index } i := b(y \$ i := c))) = tb-H x (a(\text{from-index } i := b))$
unfolding $tb-H-def$
apply (*intro arg-cong*[**where** $?f = xor-fold$])
by (*simp-all add: assms*)

3 Proofs

3.1 Proof of 1-independence and uniformity

lemma *prob-tb-H-bin*:

shows $measure-pmf.prob (tb-S n) \{h. tb-H x h = \alpha\} = 1 / real (card R)$ (**is** $?lhs = ?rhs$)

proof –

let $?N = N n$
let $?H = H n$
let $?tb-S = tb-S n$
let $?x0 = x \$ to-index 0$

note *finite-PiE*[*simp*] *PiE-eq-empty-iff*[*simp*] *measure-pmf-single*[*simp*]

have *bij*:

bij-betw ($\lambda(a, b, c). a(0 := b(?x0 := c))$)
 $((?N - \{0\} \rightarrow_E D \rightarrow_E R) \times (D - \{?x0\} \rightarrow_E R) \times R)$
 $?H$
by (*fastforce intro!*: *bij-betw-funcsetE.remove1-remove1*)

let $?destructure =$

pair-pmf (*pmf-of-set* ($?N - \{0\} \rightarrow_E D \rightarrow_E R$))
 $(\text{pair-pmf } (\text{pmf-of-set } (D - \{?x0\} \rightarrow_E R))$
 $(\text{pmf-of-set } R))$

have *asmap*: $?tb-S =$

$map-pmf (\lambda(a, b, c). a(0 := b(?x0 := c))) ?destructure$
unfolding *tb-S-def*

by (*simp add: bij flip: pmf-of-set-prod-eq map-pmf-of-set-bij-betw del: PiE-UNIV*)

have $?lhs =$

$measure-pmf.prob ?destructure$
 $(\text{Sigma } UNIV (\lambda h.$
 $\text{Sigma } UNIV (\lambda Z.$
 $\{tb-H x (h(0 := Z(?x0 := \alpha))\}))$

unfolding *asmap measure-map-pmf* **by** (*clarsimp intro!*: *measure-pmf-cong tb-H-exch*)

also have $\dots = ?rhs$ **by** (*simp add: measure-pmf-prob-dependent-product-bound-eq*)

finally show $?thesis$.

qed

theorem *uniform*:

shows *prob-space.uniform-on* (*tb-S* *n*) (*tb-H* *key*) *R*
using *prob-tb-H-bin* **by** (*auto intro!*: *measure-pmf.uniform-onI*)

3.2 Proof of two-independence

lemma *prob-tb-H-bin1-bin2*:

assumes $x \neq y$

shows *measure-pmf.prob* (*tb-S* *n*) $\{h. \text{tb-H } x \ h = \alpha \wedge \text{tb-H } y \ h = \beta\} = 1 / \text{real}$
(*card* *R* * *card* *R*)

(**is** *?lhs* = *?rhs*)

proof –

let *?N* = *N* *n*

let *?H* = *H* *n*

let *?tb-S* = *tb-S* *n*

note *finite-PiE*[*simp*] *PiE-eq-empty-iff*[*simp*] *measure-pmf-single*[*simp*]

obtain *i* **where** $i: x \ \$ \ i \neq y \ \$ \ i$ **by** (*meson* *assms* *vec-cong*)

let *?xi* = $x \ \$ \ i$

let *?yi* = $y \ \$ \ i$

have *bij*:

bij-betw ($\lambda(a, b, c, d). a(\text{from-index } i := b(?xi := c, ?yi := d))$)
($(?N - \{\text{from-index } i\} \rightarrow_E D \rightarrow_E R) \times (D - \{?xi, ?yi\} \rightarrow_E R) \times R \times R$)
?H

using *i* **by** (*intro* *bij-betw-funcsetE.remove1-remove2*) *simp-all*

let *?destructure* =

pair-pmf (*pmf-of-set* ($?N - \{\text{from-index } i\} \rightarrow_E D \rightarrow_E R$))
(*pair-pmf* (*pmf-of-set* ($D - \{?xi, ?yi\} \rightarrow_E R$))
(*pmf-of-set* ($R \times R$))))

have *asmap*: *?tb-S* =

map-pmf ($\lambda(a, b, c, d). a(\text{from-index } i := b(?xi := c, ?yi := d))$) *?destructure*

unfolding *tb-S-def*

by (*simp* *add*: *bij* *flip*: *pmf-of-set-prod-eq* *map-pmf-of-set-bij-betw*
del: *PiE-UNIV* *UNIV-Times-UNIV*)

have *?lhs* =

measure-pmf.prob *?destructure*

(*Sigma* *UNIV* ($\lambda h.$

Sigma *UNIV* ($\lambda I.$

$\{(xi', yi'). \text{tb-H } x \ (h(\text{from-index } i := I(?xi := xi', ?yi := yi'))) = \alpha \wedge$

$\text{tb-H } y \ (h(\text{from-index } i := I(?xi := xi', ?yi := yi'))) = \beta \ \}))$)

unfolding *asmap* *measure-map-pmf* **by** (*auto* *intro*: *measure-pmf-cong*)

also from i have ... =
measure-pmf.prob ?destructure
 (Sigma UNIV (λh .
 Sigma UNIV (λI .
 {(tb-H x (h(from-index i := I(?xi := α , ?yi := β))),
 tb-H y (h(from-index i := I(?xi := α , ?yi := β)))))))))
apply (clarsimp intro!: *measure-pmf-cong simp: tb-H-discard tb-H-exch'*)
by (smt (verit, ccfv-threshold) *fun-upd-twist tb-H-discard*)

also have ... = ?rhs **by** (*simp add: measure-pmf-prob-dependent-product-bound-eq'*)

finally show ?thesis .
qed

3.3 Proof of 3-independence

lemma *prob-3same-conv*:

assumes x \$ i \neq y \$ i y \$ i \neq z \$ i z \$ i \neq x \$ i
shows *measure-pmf.prob* (tb-S n) {h. tb-H x h = α \wedge tb-H y h = β \wedge tb-H z h = γ } =
 $1 / (\text{real}(\text{card } R) * \text{real}(\text{card } R) * \text{real}(\text{card } R))$ (is ?lhs = ?rhs)

proof –

let ?N = N n
let ?H = H n
let ?tb-S = tb-S n
let ?xi = x \$ i
let ?yi = y \$ i
let ?zi = z \$ i

note *finite-PiE[simp]* *PiE-eq-empty-iff[simp]* *measure-pmf-single[simp]*

from *assms* **have** *bij*:

bij-betw ($\lambda(a, b, c, d, e). a(\text{from-index } i := b(?xi := c , ?yi := d , ?zi := e)))
 ((?N - {from-index i } \rightarrow_E $D \rightarrow_E R$) \times (D - {?xi, ?yi, ?zi} $\rightarrow_E R$) $\times R \times R \times R$)
 ?H
by (*fastforce intro: bij-betw-funcsetE.remove1-remove3*)$

let ?destructure =

(pair-pmf (pmf-of-set (?N - {from-index i } $\rightarrow_E D \rightarrow_E R$))
 (pair-pmf (pmf-of-set (D - {?xi, ?yi, ?zi} $\rightarrow_E R$))
 (pmf-of-set ($R \times R \times R$))))

have *asmap*: ?tb-S =

map-pmf ($\lambda(a, b, c, d, e). a(\text{from-index } i := b(?xi := c , ?yi := d , ?zi := e)))
 ?destructure$

unfolding *tb-S-def*

by (*simp add: bij flip: pmf-of-set-prod-eq map-pmf-of-set-bij-betw*
del: PiE-UNIV UNIV-Times-UNIV)

have $?lhs =$
measure-pmf.prob *?destructure*
 (*Sigma UNIV* ($\lambda h.$
 Sigma UNIV ($\lambda I.$
 $\{(xi', yi', zi') .$
 $tb-H\ x\ (h(\text{from-index } i := I(?xi := xi', ?yi := yi', ?zi := zi')) = \alpha \wedge$
 $tb-H\ y\ (h(\text{from-index } i := I(?xi := xi', ?yi := yi', ?zi := zi')) = \beta \wedge$
 $tb-H\ z\ (h(\text{from-index } i := I(?xi := xi', ?yi := yi', ?zi := zi')) = \gamma)\}$)))
unfolding *asmap measure-map-pmf by* (*auto intro: measure-pmf-cong*)

also from *assms have ... =*
measure-pmf.prob *?destructure*
 (*Sigma UNIV* ($\lambda h.$
 Sigma UNIV ($\lambda I.$
 $\{(xi', yi', zi') .$
 $tb-H\ x\ (h(\text{from-index } i := I(?xi := xi')) = \alpha \wedge$
 $tb-H\ y\ (h(\text{from-index } i := I(?yi := yi')) = \beta \wedge$
 $tb-H\ z\ (h(\text{from-index } i := I(?zi := zi')) = \gamma)\}$)))
unfolding *asmap measure-map-pmf*
apply (*clarsimp intro!: measure-pmf-cong simp: tb-H-discard*)
by (*smt (verit, best) fun-upd-twist tb-H-discard*)

also have $... =$
 (*measure-pmf.prob* *?destructure*
 (*Sigma UNIV* ($\lambda h.$
 Sigma UNIV ($\lambda I.$
 $\{\text{let } xi' = tb-H\ x\ (h(\text{from-index } i := I(?xi := \alpha)));$
 $yi' = tb-H\ y\ (h(\text{from-index } i := I(?yi := \beta)));$
 $zi' = tb-H\ z\ (h(\text{from-index } i := I(?zi := \gamma))$
 $\text{in } (xi', yi', zi')\}\}$)))
by (*auto simp add: tb-H-exch' intro: measure-pmf-cong conj-cong*)

also have $... = ?rhs$ **by** (*simp add: measure-pmf-prob-dependent-product-bound-eq'*)

finally show *?thesis .*

qed

lemma *prob-2same-conv:*

assumes $x\ \$\ i\ \neq\ y\ \$\ i\ z\ \$\ j\ \neq\ x\ \$\ j\ i\ \neq\ j$

and $z\ \$\ i = x\ \$\ i$

shows *measure-pmf.prob* ($tb-S\ n$) $\{h. tb-H\ x\ h = \alpha \wedge tb-H\ y\ h = \beta \wedge tb-H\ z\ h = \gamma\} =$

$1 / (\text{real } (card\ R) * \text{real } (card\ R) * \text{real } (card\ R))$ (**is** $?lhs = ?rhs$)

proof –

let $?N = N\ n$

let $?H = H\ n$

let $?tb-S = tb-S\ n$

```

let ?xi = x $ i
let ?yi = y $ i
let ?zi = z $ i
let ?xj = x $ j
let ?yj = y $ j
let ?zj = z $ j

note finite-PiE[simp] PiE-eq-empty-iff[simp] measure-pmf-single[simp]

from assms have bij:
  bij-betw
  (λ(a, b, c, d, e, f). a(from-index i := b(?xi := d, ?yi := e), from-index j :=
c(?zj := f)))
  ((?N - {from-index i, from-index j} →E D →E R) ×
  (D - {?xi, ?yi} →E R) ×
  (D - {?zj} →E R) ×
  R × R × R)
  ?H
  by (fastforce intro: bij-betw-funcsetE.remove2-remove2'remove1)

let ?destructure =
  (pair-pmf (pmf-of-set (?N - {from-index i, from-index j} →E D →E R))
  (pair-pmf (pmf-of-set (D - {?xi, ?yi} →E R))
  (pair-pmf (pmf-of-set (D - {?zj} →E R))
  (pmf-of-set (R × R × R))))))

have asmap: ?tb-S =
  map-pmf
  (λ(a, b, c, d, e, f). a(from-index i := b(?xi := d, ?yi := e), from-index j :=
c(?zj := f)))
  ?destructure
  unfolding tb-S-def
  by (simp add: bij flip: pmf-of-set-prod-eq map-pmf-of-set-bij-betw
  del: PiE-UNIV UNIV-Times-UNIV)

have ?lhs =
  (measure-pmf.prob ?destructure
  (Sigma UNIV (λh.
  Sigma UNIV (λI.
  Sigma UNIV (λJ.
  {(xi', yi', zj').
  tb-H x (h(from-index i := I(?xi := xi', ?yi := yi'), from-index j := J(?zj :=
zj')))) = α ∧
  tb-H y (h(from-index i := I(?xi := xi', ?yi := yi'), from-index j := J(?zj :=
zj')))) = β ∧
  tb-H z (h(from-index i := I(?xi := xi', ?yi := yi'), from-index j := J(?zj :=
zj')))) = γ
  }))))))
  unfolding asmap measure-map-pmf by (auto intro: measure-pmf-cong)

```

also from *assms* have ... =
(measure-pmf.prob ?destructure
(Sigma UNIV (λh.
Sigma UNIV (λI.
Sigma UNIV (λJ.
{(xi',yi',zj').
tb-H x (h(from-index j := J, from-index i := I(?xi := xi')) = α ∧
tb-H y (h(from-index j := J(?zj := zj'), from-index i := I(?yi := yi')) = β ∧
tb-H z (h(from-index i := I(?xi := xi'), from-index j := J(?zj := zj')) = γ
))))))
unfolding *asmap measure-map-pmf*
apply (*clarsimp intro!: measure-pmf-cong dest!: from-index-neq simp: tb-H-discard*
by (*smt (verit, best) fun-upd-twist tb-H-discard*)

also have ... =
measure-pmf.prob ?destructure
(Sigma UNIV (λh.
Sigma UNIV (λI.
Sigma UNIV (λJ.
{let
xi' = tb-H x (h(from-index j := J, from-index i := I(?xi := α)));
zj' = tb-H z (h(from-index i := I(?xi := xi'), from-index j := J(?zj := γ)));
yi' = tb-H y (h(from-index j := J(?zj := zj'), from-index i := I(?yi := β)));
in (xi',yi',zj')})
by (*auto simp add: Let-unfold tb-H-exch' intro: measure-pmf-cong*)

also have ... = ?rhs by (*simp add: measure-pmf-prob-dependent-product-bound-eq'*)

finally show ?thesis .

qed

lemma *prob-tb-H-bin1-bin2-bin3*:

assumes $x \neq y \ y \neq z \ z \neq x$

shows $\text{measure-pmf.prob } (tb-S \ n) \ \{h. \ tb-H \ x \ h = \alpha \wedge \ tb-H \ y \ h = \beta \wedge \ tb-H \ z \ h = \gamma\} =$

$1 / (\text{real } (card \ R) * \text{real } (card \ R) * \text{real } (card \ R)) \ (\text{is } ?lhs = ?rhs)$

proof –

obtain *i* where $i: x \ \$ \ i \neq y \ \$ \ i$ using *assms(1) vec-cong* by *blast*

let $?xi = x \ \$ \ i$

let $?yi = y \ \$ \ i$

let $?zi = z \ \$ \ i$

consider $?zi \neq ?xi \wedge ?zi \neq ?yi \mid ?zi = ?xi \mid ?zi = ?yi$ **by *blast***

then show ?thesis

proof cases

case 2

moreover from *assms vec-cong* obtain *j* where $z \ \$ \ j \neq x \ \$ \ j$ by *blast*

```

ultimately show ?thesis using i assms by (auto intro: prob-2same-conv)
next
case 3
moreover obtain j where z $ j ≠ y $ j using assms(2) vec-cong by blast
ultimately show ?thesis
using i assms
by (subst prob-2same-conv[where y = x, symmetric]) (auto simp: ac-simps)
qed (auto intro!: prob-3same-conv simp: assms i)
qed

```

3.4 Proof of 3-universal

lemma three-indep-vars:

```

shows prob-space.k-wise-indep-vars (tb-S n) 3 (λ-. count-space R) tb-H D^n
proof (rule prob-space.k-wise-indep-varsI)
show prob-space (measure-pmf (tb-S n)) using measure-pmf.prob-space-axioms
by blast
show measure-pmf (tb-S n) = measure-pmf (tb-S n) by (rule refl)
next
fix J :: ('fragment, 'n) vec set assume card J ≤ 3 finite J
fix f
consider (0) card J = 0
| (1) card J = 1
| (2) card J = 2
| (3) card J = 3 using ⟨card J ≤ 3⟩ by linarith
then show measure-pmf.prob (tb-S n) {h. ∀ key∈J. tb-H key h = f key} =
(∏ key∈J. measure-pmf.prob (tb-S n) {h. tb-H key h = f key})
(is ?lhs = ?rhs)
proof cases
case 0
then have J = {} using ⟨finite J⟩ card-0-eq by blast
then have ?lhs = 1 by simp
also have ... = ?rhs unfolding ⟨J = {}⟩ prod.empty ..
finally show ?thesis .
next
case 1
then have ∃ key. J = {key} by (meson card-1-singletonE)
then obtain key where [simp]: J = {key} by blast
— Since there is only one value inhabiting J, we can erase the quantifier
then have ?lhs = measure-pmf.prob (tb-S n) {h. tb-H key h = f key} by simp
also have ... = ?rhs by simp
finally show ?thesis .
next
case 2
then have ∃ k1 k2. J = {k1,k2} ∧ k1 ≠ k2 by (meson card-2-iff)
then obtain k1 k2 where [simp]: J = {k1,k2} k1 ≠ k2 by blast+

have ?lhs = measure-pmf.prob (tb-S n) {h. tb-H k1 h = f k1 ∧ tb-H k2 h = f
k2} by simp

```

also have ... = 1 / (real (card R) * real (card R)) using prob-tb-H-bin1-bin2
 by simp
 also have ... = ($\prod_{key \in J}. \text{indicat-real } R (f \text{ key}) / \text{real (card R)}$) by simp
 also have ... = ?rhs using prob-tb-H-bin by fastforce
 finally show ?thesis .
 next
 case 3
 then have $\exists k1 \ k2 \ k3. J = \{k1, k2, k3\} \wedge k1 \neq k2 \wedge k2 \neq k3 \wedge k3 \neq k1$ by
 (metis card-3-iff)
 then obtain $k1 \ k2 \ k3$ where [simp]: $J = \{k1, k2, k3\} \ k1 \neq k2 \ k2 \neq k3 \ k3 \neq$
 $k1 \ k1 \neq k3$
 by blast+

 have ?lhs = measure-pmf.prob (tb-S n)
 {h. tb-H k1 h = f k1 \wedge tb-H k2 h = f k2 \wedge tb-H k3 h = f k3} by simp
 also have ... = 1 / (real (card R) * real (card R) * real (card R))
 using prob-tb-H-bin1-bin2-bin3 by simp
 also have ... = ($\prod_{key \in J}. \text{indicat-real } R (f \text{ key}) / \text{real (card R)}$) by simp
 also have ... = ?rhs using prob-tb-H-bin by fastforce
 finally show ?thesis .
 qed
 qed

theorem three-universal:

shows prob-space.k-universal (tb-S n) 3 tb-H D^n R
 using prob-space.k-universal-def measure-pmf.prob-space-axioms three-indep-vars
 uniform by blast

3.5 Proof of non-4-universal

lemma prob-4-conv:

fixes $u \ v :: \text{'fragment}$
 assumes $W \oplus X \oplus Y \oplus Z = 0 \wedge h. P (h(0 := \text{undefined}, \text{Suc } 0 := \text{undefined}))$
 $= P \ h$

$CARD('n) > \text{Suc } 0 \ u \neq v$

shows measure-pmf.prob (tb-S n) {h::nat \Rightarrow 'fragment \Rightarrow ('result, 'q) vec.

$h \ 0 \ u \oplus h (\text{Suc } 0) \ u \oplus P \ h = W \wedge$

$h \ 0 \ u \oplus h (\text{Suc } 0) \ v \oplus P \ h = X \wedge$

$h \ 0 \ v \oplus h (\text{Suc } 0) \ u \oplus P \ h = Y \wedge$

$h \ 0 \ v \oplus h (\text{Suc } 0) \ v \oplus P \ h = Z \}$

= 1 / (real (card R) * real (card R) * real (card R)) (is ?lhs = ?rhs)

proof –

let ?N = N n

let ?H = H n

let ?tb-S = tb-S n

note assms(1,2) [simp]

note finite-PiE[simp] PiE-eq-empty-iff[simp] measure-pmf-single[simp]

define $W' X' Y' Z'$ **where**

$W' \equiv \lambda h. W \oplus P h$

$X' \equiv \lambda h. X \oplus P h$

$Y' \equiv \lambda h. Y \oplus P h$

$Z' \equiv \lambda h. Z \oplus P h$

have *xor-sum*: $W' h \oplus X' h \oplus Y' h \oplus Z' h = 0$ **for** h

by (*simp add*: $W'-X'-Y'-Z'$ -def commute left-commute)

have *bij*:

bij-betw

$(\lambda(a, b, c, d, e, f). a(\text{Suc } 0 := b(u := d, v := e), 0 := c(v := f)))$

$((?N - \{\text{Suc } 0, 0\} \rightarrow_E D \rightarrow_E R) \times$

$(D - \{u, v\} \rightarrow_E R) \times$

$(D - \{v\} \rightarrow_E R) \times$

$R \times R \times R)$

$?H$

using *assms* **by** (*intro* *bij-betw-funcsetE.remove2-remove2'remove1*) *simp-all*

let *?destructure* =

$(\text{pair-pmf } (\text{pmf-of-set } (?N - \{\text{Suc } 0, 0\} \rightarrow_E D \rightarrow_E R))$

$(\text{pair-pmf } (\text{pmf-of-set } (D - \{u, v\} \rightarrow_E R))$

$(\text{pair-pmf } (\text{pmf-of-set } (D - \{v\} \rightarrow_E R))$

$(\text{pmf-of-set } (R \times R \times R))))))$

have *asmap*: $?tb-S =$

map-pmf

$(\lambda(a, b, c, d, e, f). a(1 := b(u := d, v := e), 0 := c(v := f)))$

?destructure

unfolding *tb-S-def*

by (*simp add*: *bij flip*: *pmf-of-set-prod-eq map-pmf-of-set-bij-betw*

del: *PiE-UNIV UNIV-Times-UNIV*)

have *?lhs* =

$(\text{measure-pmf.prob } ?destructure$

$(\text{Sigma } UNIV (\lambda h.$

$\text{Sigma } UNIV (\lambda I1.$

$\text{Sigma } UNIV (\lambda I0.$

$\{(u1, v1, v0).$

$I0 u \oplus u1 \oplus P h = W \wedge$

$I0 u \oplus v1 \oplus P h = X \wedge$

$v0 \oplus u1 \oplus P h = Y \wedge$

$v0 \oplus v1 \oplus P h = Z\})\})\})\})$

unfolding *asmap measure-map-pmf*

apply (*clarsimp intro!*: *measure-pmf-cong simp add*: *assms(4)*)

by (*smt* (*z3*) *array-rules(5) assms(2) fun-upd-twist*)

also have ... =

```

measure-pmf.prob ?destructure
(Sigma UNIV (λh.
  Sigma UNIV (λI1.
    Sigma UNIV (λI0.
      {(u1,v1,v0).
        I0 u ⊕ u1 = W' h ∧
        I0 u ⊕ v1 = X' h ∧
        v0 ⊕ u1 = Y' h ∧
        v0 ⊕ v1 = Z' h }))))
apply (clarsimp intro!: measure-pmf-cong)
unfolding W'-X'-Y'-Z'-def
by (smt (verit, best) assoc right-neutral self-inv)

```

```

also have ... =
measure-pmf.prob ?destructure
(Sigma UNIV (λh.
  Sigma UNIV (λI1.
    Sigma UNIV (λI0.
      {(I0 u ⊕ W' h,
        I0 u ⊕ X' h,
        I0 u ⊕ W' h ⊕ Y' h }))))
apply (clarsimp intro!: measure-pmf-cong)
by (smt (z3) xor-sum assoc abel-group-xor-class.eq-iff)

```

```

also have ... = ?rhs
apply (subst measure-pmf-prob-dependent-product-bound-eq'[where r = ?rhs])+
by simp-all

```

```

finally show ?thesis .
qed

```

lemma not-four-indep:

```

assumes CARD('n) > 1 — if n = 1, then tabulation hashing is 4-independent
card D ≥ 2 — if D = or D = x, then it is impossible to obtain 4 distinct

```

keys

```

card R > 1 — tabulation hashing is 4-independent otherwise

```

```

shows ¬ prob-space.k-wise-indep-vars (tb-S n) 4 (λ-. count-space R) tb-H Dn

```

proof –

```

let ?tb-S = tb-S n

```

```

fix f :: ('fragment, 'n) vec ⇒ ('result, 'q) vec

```

```

obtain u v :: 'fragment where pq [simp]: u ≠ v by (meson assms(2) UNIV-I
card-2-iff' ex-card)

```

```

define u-n where u-n ≡ replicate (CARD('n) - 2) u

```

```

let ?w = u # u # u-n

```

```

let ?x = u # v # u-n

```

```

let ?y = v # u # u-n

```

```

let ?z = v # v # u-n

```

define $w\ x\ y\ z :: ('fragment, 'n)\ \text{vec}$ **where** $wxyz$:
 $w = \text{vec-of-list } ?w\ x = \text{vec-of-list } ?x\ y = \text{vec-of-list } ?y\ z = \text{vec-of-list } ?z$
define J **where** $[simp]$: $J = \{w,x,y,z\}$

have $N: a \# b \# u-n \in \{xs.\ \text{length } xs = \text{CARD}('n)\}$ **for** $a\ b$
unfolding $u-n\text{-def}$ **using** $assms(1)$ **by** $simp$

have $distinct\ [simp]$: $w \neq x\ w \neq y\ w \neq z\ x \neq y\ x \neq z\ y \neq z$
using N **by** $(simp\text{-all}\ \text{add: } wxyz\ \text{vec-of-list-inject})$

have $[simp]$: $\text{card } J = 4$ **by** $simp$

have $[simp]$:
 $w\ \$\ \text{to-index } 0 = u\ w\ \$\ \text{to-index } (\text{Suc } 0) = u$
 $x\ \$\ \text{to-index } 0 = u\ x\ \$\ \text{to-index } (\text{Suc } 0) = v$
 $y\ \$\ \text{to-index } 0 = v\ y\ \$\ \text{to-index } (\text{Suc } 0) = u$
 $z\ \$\ \text{to-index } 0 = v\ z\ \$\ \text{to-index } (\text{Suc } 0) = v$
using N **by** $(simp\text{-all}\ \text{add: } wxyz\ \text{nth-vec.rep-eq}\ \text{vec-of-list-inverse}\ \text{to-from-index})$

have rw :
 $\text{xor-fold } (\text{map } (\lambda i.\ h\ i\ ((a \# b \# u-n)!\ \text{from-index } (\text{to-index } i :: 'n))))\ [0..<\text{CARD}('n)])$

=

$h\ 0\ a \oplus$
 $h\ (\text{Suc } 0)\ b \oplus$
 $\text{xor-fold } (\text{map } (\lambda i.\ h\ i\ u)\ [\text{Suc } (\text{Suc } 0)..<\text{CARD}('n)])$
 $(\text{is } \text{xor-fold } ?a = -)$ **for** $a\ b\ h$

proof –

have $?a = h\ 0\ a \# h\ (\text{Suc } 0)\ b \# \text{map } (\lambda i.\ h\ i\ u)\ [\text{Suc } (\text{Suc } 0)..<\text{CARD}('n)]$
using $assms(1)$ **by** $(\text{auto}\ \text{simp: } \text{upt-conv-Cons}\ \text{to-from-index}\ u-n\text{-def})$

then show $?thesis$ **by** $simp$

qed

have $\neg\ \text{prob-space.indep-vars } ?tb-S\ (\lambda.\ \text{count-space UNIV})\ tb-H\ J$

proof –

have $\text{measure-pmf.prob } ?tb-S\ \{h.\ \forall\ key \in J.\ tb-H\ key\ h = f\ key\}$
 $\neq 1/(\text{card } R * \text{card } R * \text{card } R * \text{card } R)$ **(is** $?lhs \neq \dots)$

proof $(\text{cases } f\ w \oplus f\ x \oplus f\ y \oplus f\ z = 0)$

case True

In this case, we want to show that the probability is $\frac{1}{R^3}$ and not $\frac{1}{R^4}$

let $?a = \lambda h.\ \text{xor-fold } (\text{map } (\lambda i.\ h\ i\ u)\ [\text{Suc } (\text{Suc } 0)..<\text{CARD}('n)])$

have $?lhs = \text{measure-pmf.prob } ?tb-S\ \{h.$

$h\ 0\ u \oplus h\ (\text{Suc } 0)\ u \oplus ?a\ h = f\ w \wedge$

$h\ 0\ u \oplus h\ (Suc\ 0)\ v \oplus ?a\ h = f\ x \wedge$
 $h\ 0\ v \oplus h\ (Suc\ 0)\ u \oplus ?a\ h = f\ y \wedge$
 $h\ 0\ v \oplus h\ (Suc\ 0)\ v \oplus ?a\ h = f\ z\}$
using N **by** (*simp add: tb-H-def wxyz nth-vec.rep-eq vec-of-list-inverse rw to-from-index*)

also have $\dots = 1 / \text{real}\ (card\ R * card\ R * card\ R)$
using *assms(1) True* **by** (*auto intro!: prob-4-conv arg-cong[where f = xor-fold]*)

finally show *?thesis* **using** *assms(3)* **by** *simp*
next
case *False*

have *False* **if** $tb-H\ w\ h = f\ w\ tb-H\ x\ h = f\ x\ tb-H\ y\ h = f\ y\ tb-H\ z\ h = f\ z$ **for**
 h

proof –
have $tb-H\ w\ h \oplus tb-H\ x\ h \oplus tb-H\ y\ h \oplus tb-H\ z\ h = 0$
using N **by** (*simp add: tb-H-def wxyz nth-vec.rep-eq vec-of-list-inverse rw to-from-index ac-simps*)

then show *False* **using** *that False* **by** *simp*

qed

then have $?lhs = 0$ **by** (*auto simp: measure-pmf-zero-iff*)

then show *?thesis* **by** *simp*

qed

moreover have $\dots = (\prod_{key \in J} \text{measure-pmf.prob}\ ?tb-S\ \{h. tb-H\ key\ h = f\ key\})$

using *prob-tb-H-bin* **by** *fastforce*

ultimately show *?thesis*

by (*intro measure-pmf.indep-vars-pmf-contrapos[where P = $\lambda\ x\ y. y = f\ x]$*)
simp-all

qed

then show *?thesis* **by** (*force simp: prob-space.k-wise-indep-vars-def prob-space-measure-pmf*)
qed

theorem *not-four-universal:*

assumes $CARD('n) > 1$ — if $n = 1$, then tabulation hashing is 4-independent

$card\ D \geq 2$ — if $D = \text{or}\ D = x$, then it is impossible to obtain 4 distinct
keys

$card\ R > 1$ — tabulation hashing is 4-independent otherwise

shows $\neg \text{prob-space.k-universal}\ (tb-S\ n)\ 4\ tb-H\ D^n\ R$

using *not-four-indep[OF assms]*

by (*simp add: prob-space.k-universal-def measure-pmf.prob-space-axioms*)

end

4 Appendix

4.1 Utility

context *prob-space*
begin

context
 fixes $K D k p$
 assumes $assms'$: $K \subseteq D$ *card* $K \leq k$ *finite* $K M = \text{measure-pmf } p$
begin

lemma *k-wise-indep-vars-probD*:
 assumes *k-wise-indep-vars* k (λ -. *count-space UNIV*) $X D$
 shows $\text{prob } \{\omega. \forall x \in K. P x (X x \omega)\} = (\prod x \in K. \text{prob } \{\omega. P x (X x \omega)\})$
 using $assms'$ *assms* **unfolding** *k-wise-indep-vars-def* **by** (*subst split-indep-events*[*of*
- $X K$]) *auto*

lemma
 assumes *k-universal* $k X D R$
 shows
 k-universal-probD:
 $\bigwedge P. \text{prob } \{\omega. \forall x \in K. P x (X x \omega)\} = (\prod x \in K. \text{prob } \{\omega. P x (X x \omega)\})$
 (**is** *PROP ?thesis-0*) **and**
 k-universal-probD':
 $\text{prob } \{\omega. \forall x \in K. X x \omega = P x\} = (\prod x \in K. \text{indicat-real } R (P x) / \text{real } (\text{card } R))$
 (**is** *?thesis-1*)

proof –
 from $assms$ *k-wise-indep-vars-probD* **show** *PROP ?thesis-0*
 unfolding *k-universal-def* **by** *fastforce*
 from *this*[*of* $\lambda x y. y = P x$] *uniform-onD*[**where** $A = R$ **and** $B = \{P -\}$] $assms'$
 $assms$
 show *?thesis-1*
 unfolding *k-universal-def*
 by (*auto intro!*: *prod.cong split: split-indicator simp: prob-space-measure-pmf*)
qed

end
end

locale *simple-tabulation-hashing'* = *simple-tabulation-hashing* +
 assumes r : $r = \text{TYPE}('result::\{\text{finite}, \text{abel-group-xor}\})$
 assumes q : $q = \text{TYPE}('q::\text{index1})$
 assumes d : $d = \text{TYPE}('fragment::\text{finite})$
begin

end

4.2 Alternate proof of non-4-universal

4.2.1 Preliminaries

lemma (in *prob-space*) *finite-if-k-universal*:

assumes *k-universal* $k \ X \ D \ R \ D \neq \{\}$

shows *finite* R

using *assms* **by** (*auto simp add: k-universal-def uniform-on-def*)

lemma *xor-sum-uniform*:

fixes $\alpha :: 'a :: \{finite, abel-group-xor\}$

defines $R \equiv UNIV$

assumes [*simp*]: *finite* $J \ J \neq \{\}$

shows *measure-pmf.prob* (*pmf-of-set* ($J \rightarrow_E R$)) $\{f. (\bigoplus_{x \in J}. f \ x) = \alpha\} = 1 /$
real *CARD*('a)

(**is** *?lhs = ?rhs*)

proof –

note *finite-PiE*[*simp*] *PiE-eq-empty-iff*[*simp*] *measure-pmf-single*[*simp*]

obtain *a* **where** $a: a \in J$ **and** *bij*: *bij-betw* ($\lambda(f, v). f(a := v)$) ($(J - \{a\} \rightarrow_E R) \times R$) ($J \rightarrow_E R$)

using *bij-betw-funcsetE.bij-PiE-remove-point*[*of - J R*] *assms*(3) **by** *blast*

have [*simp*]: $R \neq \{\}$ **using** *assms*(1) **by** *blast*

have [*simp*]: *set-pmf* (*pmf-of-set* ($J \rightarrow_E R$)) = $J \rightarrow_E R$

set-pmf (*pmf-of-set* ($J - \{a\} \rightarrow_E R$)) = $J - \{a\} \rightarrow_E R$

set-pmf (*pmf-of-set* R) = R

by (*auto intro!: set-pmf-of-set*)

let *?destructure* =

(*pair-pmf* (*pmf-of-set* ($J - \{a\} \rightarrow_E R$))

(*pmf-of-set* R))

have *asmap*: *pmf-of-set* ($J \rightarrow_E R$) = *map-pmf* ($\lambda(f, v). f(a := v)$) *?destructure*

using *assms* *bij* **by** (*simp flip: pmf-of-set-prod-eq map-pmf-of-set-bij-betw*

del: PiE-UNIV UNIV-Times-UNIV)

have *?lhs = measure-pmf.prob* (*pmf-of-set* ($J \rightarrow_E R$)) $\{f \in J \rightarrow_E R. (\bigoplus_{x \in J}. f \ x) = \alpha\}$

apply (*subst measure-Int-set-pmf[symmetric]*)

by (*auto intro!: arg-cong[where ?f = measure-pmf.prob -]*)

also have ... =

measure-pmf.prob *?destructure*

(*Sigma* ($J - \{a\} \rightarrow_E R$) ($\lambda f. \{x. x \oplus (\bigoplus_{x \in J - \{a\}}. f \ x) = \alpha\}$))

using *PiE-fun-upd a* **by** (*auto simp add: asmap xor-sum.remove[where ?x =*

$a, OF\ assms(2)\ a]$

intro!: *measure-pmf-cong*)

also have ... =

measure-pmf.prob ?*destructure*

$(Sigma\ (J - \{a\} \rightarrow_E\ R)\ (\lambda f. \{\alpha \oplus (\bigoplus_{x \in J - \{a\}} f\ x)\}))$

by (*fastforce* *intro*: *measure-pmf-cong* *simp* *add*: *ac-simps*)

also have ... = ?*rhs*

by (*simp* *add*: *assms(1)* *measure-pmf-prob-dependent-product-bound-eq'* *measure-pmf-of-set*)

finally show ?*lhs* = ?*rhs* .

qed

lemma *k-universal-conv-pmf-of-set*:

defines $R \equiv UNIV$

assumes *prob-space.k-universal* (*measure-pmf* p) $k\ X\ D\ R$

and $J \subseteq D$ *card* $J \leq k$ *finite* $J\ D \neq \{\}$

shows *map-pmf* $(\lambda \omega. \lambda x \in J. X\ x\ \omega)\ p = \text{pmf-of-set}\ (J \rightarrow_E\ R)$

proof (*intro* *pmf-eqI*)

fix P

from *assms(2)* **have** fR : *finite* R **by** (*simp* *add*: *assms(6)* *measure-pmf.finite-if-k-universal*)

{

assume P : $P \in J \rightarrow_E\ R$

have *pmf* (*map-pmf* $(\lambda \omega. \lambda x \in J. X\ x\ \omega)\ p)\ P = \text{measure-pmf.prob}\ p\ \{\omega. (\lambda x \in J. X\ x\ \omega) = P\}$

by (*simp* *add*: *pmf-map* *vimage-def*)

also have ... = *measure-pmf.prob* $p\ \{\omega. \forall x \in J. X\ x\ \omega = P\ x\}$

using P **by** (*fastforce* *intro*: *arg-cong*[**where** ? $f = \text{measure-pmf.prob}\ -]$)

also have ... = $(\prod_{x \in J. \text{indicat-real}\ R\ (P\ x)} / \text{real}\ (\text{card}\ R))$

using *assms* **by** (*simp* *add*: *measure-pmf.k-universal-probD'*)

also have ... = $(1 / \text{real}\ (\text{card}\ R)) \wedge \text{card}\ J$

apply (*subst* *prod.cong*[**where** ? $B = J$ **and** ? $h = \lambda -. 1 / \text{real}\ (\text{card}\ R)$]; *simp*)

by (*metis* P *indicator-simps(1)* *PiE-E*)

also have ... = *indicat-real* $(J \rightarrow_E\ R)\ P / \text{real}\ (\text{card}\ (J \rightarrow_E\ R))$

by (*simp* *add*: P *assms(5)* *card-funcsetE* *power-one-over*)

also have ... = *pmf* (*pmf-of-set* $(J \rightarrow_E\ R))\ P$

using P **by** (*subst* *pmf-of-set*) (*auto* *simp* *add*: *assms(5)* fR *finite-PiE*)

finally have $\text{pmf } (\text{map-pmf } (\lambda\omega. \lambda x \in J. X x \omega) p) P = \text{pmf } (\text{pmf-of-set } (J \rightarrow_E R)) P$.
}

moreover {
assume $P: P \notin J \rightarrow_E R$

have $\text{pmf } (\text{map-pmf } (\lambda\omega. \lambda x \in J. X x \omega) p) P = \text{measure-pmf.prob } p \{ \omega. (\lambda x \in J. X x \omega) = P \}$

by (*simp add: pmf-map vimage-def*)

also have $\dots = 0$

proof (*subst measure-pmf-zero-iff*)

have $\{ \omega. (\lambda x \in J. X x \omega) = P \} = \{ \}$

using $P \text{ assms}(1)$

by (*auto simp add: measure-pmf.prob-space-axioms prob-space.k-universal-def*)

then show $\text{set-pmf } p \cap \{ \omega. (\lambda x \in J. X x \omega) = P \} = \{ \}$ **by** *blast*

qed

also have $\dots = \text{pmf } (\text{pmf-of-set } (J \rightarrow_E R)) P$

apply (*rule sym*)

apply (*subst pmf-eq-0-set-pmf*)

apply (*subst set-pmf-of-set*)

subgoal by (*simp add: PiE-eq-empty-iff assms(1)*)

subgoal by (*simp add: assms(5) fR finite-PiE*)

using P .

finally have $\text{pmf } (\text{map-pmf } (\lambda\omega. \lambda x \in J. X x \omega) p) P = \text{pmf } (\text{pmf-of-set } (J \rightarrow_E R)) P$.
}

ultimately show $\text{pmf } (\text{map-pmf } (\lambda\omega. \lambda x \in J. X x \omega) p) P = \text{pmf } (\text{pmf-of-set } (J \rightarrow_E R)) P$ **by** *blast*

qed

lemma *k-universal-imp-xor-sum-uniform:*

fixes $\alpha :: 'a :: \{ \text{finite, abel-group-xor} \}$

defines $R \equiv UNIV$

assumes *prob-space.k-universal (measure-pmf p) k X D R*

and $J \subseteq D \text{ card } J \leq k \text{ finite } J J \neq \{ \}$

shows $\text{measure-pmf.prob } p \{ \omega. (\bigoplus x \in J. X x \omega) = \alpha \} = 1 / \text{real } (\text{card } R)$

(**is** *?lhs = ?rhs*)

proof –

have *?lhs = measure-pmf.prob (map-pmf (lambda omega. lambda x in J. X x omega) p) {f. (bigoplus x in J. f x) = alpha}* **by** *simp*

also have $\dots = \text{measure-pmf.prob } (\text{pmf-of-set } (J \rightarrow_E R)) \{ f. (\bigoplus x \in J. f x) = \alpha \}$

using *assms by (intro arg-cong2[where ?f = measure-pmf.prob])*

(auto intro!: k-universal-conv-pmf-of-set)

also have ... = ?rhs using *assms* by (auto intro!: xor-sum-uniform)
 finally show ?lhs = ?rhs .
 qed

4.2.2 Proofs

context *simple-tabulation-hashing* begin

lemma *k-wise-indep-vars-imp-xor-sum-uniform*:

assumes *prob-space.k-wise-indep-vars* (tb-S n) k (λ-. count-space R) tb-H Dⁿ
 J ≠ {} card J ≤ k
 shows *measure-pmf.prob* (tb-S n) {h. (⊕ x∈J. tb-H x h) = α} = 1 / real (card R)
 using *assms*
 by (auto
 intro: *k-universal-imp-xor-sum-uniform*[where ?k = k and ?D = Dⁿ]
 simp: *prob-space.k-universal-def prob-space-measure-pmf uniform*)

lemma *not-k-wise-indep-vars-by-xor-sum*:

assumes *measure-pmf.prob* (tb-S n) {h. (⊕ x∈J. tb-H x h) = α} ≠ 1 / real (card R)
 J ≠ {} card J ≤ k
 shows ¬ *prob-space.k-wise-indep-vars* (tb-S n) k (λ-. count-space R) tb-H Dⁿ
 using *assms(1)* apply (rule *contrapos-nn*)
 using *assms* by (simp add: *k-wise-indep-vars-imp-xor-sum-uniform*)

lemma *not-four-indep'*:

assumes *CARD('n) > 1* — if n = 1, then tabulation hashing is 4-independent
 card D ≥ 2 — if D = or D = x, then it is impossible to obtain 4 distinct
 keys
 card R > 1 — tabulation hashing is 4-independent otherwise
 shows ¬ *prob-space.k-wise-indep-vars* (tb-S n) 4 (λ-. count-space R) tb-H Dⁿ
 proof —

obtain u v :: 'fragment where pq [simp]: u ≠ v by (meson *assms(2)* *UNIV-I card-2-iff' ex-card*)

define *u-n* where *u-n* ≡ replicate (CARD('n) - 2) u
 let ?w = u # u # u-n
 let ?x = u # v # u-n
 let ?y = v # u # u-n
 let ?z = v # v # u-n

define *w x y z* :: ('fragment, 'n) vec where *wxyz*:

w = *vec-of-list* ?w *x* = *vec-of-list* ?x *y* = *vec-of-list* ?y *z* = *vec-of-list* ?z
 define *J* where [simp]: *J* = {w,x,y,z}

have *N*: a # b # u-n ∈ {xs. length xs = CARD('n)} for a b
 using *assms(1)* by (simp add: *u-n-def*)

```

have [simp]:  $w \neq x \wedge w \neq y \wedge w \neq z \wedge x \neq y \wedge x \neq z \wedge y \neq z$ 
using  $N$  by (simp-all add: vec-of-list-inject wxyz)

have [simp]:  $\text{card } J = 4$  by simp

have rw:
  xor-fold (map ( $\lambda i. h\ i\ ((a \# b \# u-n) ! \text{from-index } (to-index\ i :: 'n))$ )) [0.. $CARD('n)$ ]
=
  h 0 a  $\oplus$ 
  h (Suc 0) b  $\oplus$ 
  xor-fold (map ( $\lambda i. h\ i\ u$ ) [Suc (Suc 0).. $CARD('n)$ ])
  (is xor-fold ?a = -) for a b h
proof -
  have ?a = h 0 a  $\#$  h (Suc 0) b  $\#$  map ( $\lambda i. h\ i\ u$ ) [Suc (Suc 0).. $CARD('n)$ ]
  using  $assms(1)$  by (auto simp: upt-conv-Cons to-from-index u-n-def)
  then show ?thesis by simp
qed

from  $N$  have  $\text{measure-pmf.prob } (tb-S\ n)\ \{h. (\bigoplus_{x \in J}. tb-H\ x\ h) = 0\} = 1$ 
  apply (simp add: tb-H-def nth-vec.rep-eq del: eq-iff)
  by (simp add: wxyz nth-vec.rep-eq vec-of-list-inverse rw ac-simps)

then show ?thesis
  using  $assms(3)$  by (intro not-k-wise-indep-vars-by-xor-sum[of J 0]) simp-all
qed
end
end

```

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