

# Probabilistic while loop

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## Abstract

This AFP entry defines a probabilistic while operator based on sub-probability mass functions and formalises zero-one laws and variant rules for probabilistic loop termination. As applications, we implement probabilistic algorithms for the Bernoulli, geometric and arbitrary uniform distributions that only use fair coin flips, and prove them correct and terminating with probability 1.

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```
theory While-SPMF imports  
  MFMC-Countable.Rel-PMF-Characterisation  
  HOL-Types-To-Sets.Types-To-Sets  
  HOL-Library.Complete-Partial-Order2  
begin
```

This theory defines a probabilistic while combinator for discrete (sub-)probabilities and formalises rules for probabilistic termination similar to those by Hurd [1] and McIver and Morgan [3].

# 1 Miscellaneous library additions

**fun** *map-option-set* :: ('a  $\Rightarrow$  'b option set)  $\Rightarrow$  'a option  $\Rightarrow$  'b option set  
**where**  
  *map-option-set* f None = {None}  
  | *map-option-set* f (Some x) = f x

**lemma** *None-in-map-option-set*:

  None  $\in$  *map-option-set* f x  $\longleftrightarrow$  None  $\in$  Set.bind (set-option x) f  $\vee$  x = None  
**by**(cases x) *simp-all*

**lemma** *None-in-map-option-set-None* [intro!]: None  $\in$  *map-option-set* f None  
**by** *simp*

**lemma** *None-in-map-option-set-Some* [intro!]: None  $\in$  f x  $\implies$  None  $\in$  *map-option-set* f (Some x)  
**by** *simp*

**lemma** *Some-in-map-option-set* [intro!]: Some y  $\in$  f x  $\implies$  Some y  $\in$  *map-option-set* f (Some x)  
**by** *simp*

**lemma** *map-option-set-singleton* [simp]: *map-option-set* ( $\lambda x. \{f x\}$ ) y = {Option.bind y f}  
**by**(cases y) *simp-all*

**lemma** *Some-eq-bind-conv*: Some y = Option.bind x f  $\longleftrightarrow$  ( $\exists z. x = \text{Some } z \wedge f z = \text{Some } y$ )  
**by**(cases x) *auto*

**lemma** *map-option-set-bind*: *map-option-set* f (Option.bind x g) = *map-option-set* (*map-option-set* f  $\circ$  g) x  
**by**(cases x) *simp-all*

**lemma** *Some-in-map-option-set-conv*: Some y  $\in$  *map-option-set* f x  $\longleftrightarrow$  ( $\exists z. x = \text{Some } z \wedge \text{Some } y \in f z$ )  
**by**(cases x) *auto*

**interpretation** *rel-spmf-characterisation* **by** *unfold-locales*(rule *rel-pmf-measureI*)  
**hide-fact** (open) *rel-pmf-measureI*

**lemma** *Sup-conv-fun-lub*: Sup = fun-lub Sup  
**by**(*auto simp add: Sup-fun-def fun-eq-iff fun-lub-def intro: arg-cong*[**where** f=Sup])

**lemma** *le-conv-fun-ord*: ( $\leq$ ) = fun-ord ( $\leq$ )  
**by**(*auto simp add: fun-eq-iff fun-ord-def le-fun-def*)

**lemmas** *parallel-fixp-induct-2-1* = *parallel-fixp-induct-uc*[

*of - - - case-prod - curry  $\lambda x. x - \lambda x. x$ ,*  
**where**  $P = \lambda f g. P (\text{curry } f) g$ ,  
*unfolded case-prod-curry curry-case-prod curry-K,*  
*OF - - - - refl refl]*  
**for**  $P$

**lemma** *monotone-Pair:*

$\llbracket \text{monotone ord orda } f; \text{monotone ord ordb } g \rrbracket$   
 $\implies \text{monotone ord (rel-prod orda ordb) } (\lambda x. (f x, g x))$   
**by**(*simp add: monotone-def*)

**lemma** *cont-Pair:*

$\llbracket \text{cont lub ord luba orda } f; \text{cont lub ord lubb ordb } g \rrbracket$   
 $\implies \text{cont lub ord (prod-lub luba lubb) (rel-prod orda ordb) } (\lambda x. (f x, g x))$   
**by**(*rule contI*)(*auto simp add: prod-lub-def image-image dest!: contD*)

**lemma** *mcont-Pair:*

$\llbracket \text{mcont lub ord luba orda } f; \text{mcont lub ord lubb ordb } g \rrbracket$   
 $\implies \text{mcont lub ord (prod-lub luba lubb) (rel-prod orda ordb) } (\lambda x. (f x, g x))$   
**by**(*rule mcontI*)(*simp-all add: monotone-Pair mcont-mono cont-Pair*)

**lemma** *mono2mono-emeasure-spmf [THEN lfp.mono2mono]:*

**shows** *monotone-emeasure-spmf:*  
 $\text{monotone (ord-spmf (=)) } (\leq) (\lambda p. \text{emeasure (measure-spmf } p))$   
**by**(*rule monotoneI le-funI ord-spmf-eqD-emeasure*)+

**lemma** *cont-emeasure-spmf: cont lub-spmf (ord-spmf (=)) Sup ( $\leq$ ) ( $\lambda p. \text{emeasure (measure-spmf } p)$ )*

**by** (*rule contI*) (*simp add: emeasure-lub-spmf fun-eq-iff image-comp*)

**lemma** *mcont2mcont-emeasure-spmf [THEN lfp.mcont2mcont, cont-intro]:*

**shows** *mcont-emeasure-spmf: mcont lub-spmf (ord-spmf (=)) Sup ( $\leq$ ) ( $\lambda p. \text{emeasure (measure-spmf } p)$ )*  
**by**(*simp add: mcont-def monotone-emeasure-spmf cont-emeasure-spmf*)

**lemma** *mcont2mcont-emeasure-spmf' [THEN lfp.mcont2mcont, cont-intro]:*

**shows** *mcont-emeasure-spmf': mcont lub-spmf (ord-spmf (=)) Sup ( $\leq$ ) ( $\lambda p. \text{emeasure (measure-spmf } p) A$ )*  
**using** *mcont-emeasure-spmf[unfolded Sup-conv-fun-lub le-conv-fun-ord]*  
**by**(*subst (asm) mcont-fun-lub-apply blast*)

**lemma** *mcont-bind-pmf [cont-intro]:*

**assumes**  $g: \bigwedge y. \text{mcont luba orda lub-spmf (ord-spmf (=)) } (g y)$   
**shows**  $\text{mcont luba orda lub-spmf (ord-spmf (=)) } (\lambda x. \text{bind-pmf } p (\lambda y. g y x))$   
**using** *mcont-bind-spmf[where  $f = \lambda \cdot. \text{spm-f-of-pmf } p$  and  $g = g$ , OF - assms]* **by**(*simp*)

**lemma** *ennreal-less-top-iff:  $x < \top \iff x \neq (\top :: \text{ennreal})$*

**by**(*cases x*) *simp-all*

**lemma** *type-definition-Domainp*:  
**fixes** *Rep Abs A T*  
**assumes** *type: type-definition Rep Abs A*  
**assumes** *T-def: T ≡ (λ(x::'a) (y::'b). x = Rep y)*  
**shows** *Domainp T = (λx. x ∈ A)*  
**proof** –  
**interpret** *type-definition Rep Abs A* **by**(*rule type*)  
**show** *?thesis unfolding Domainp-iff[abs-def] T-def fun-eq-iff* **by**(*metis Abs-inverse Rep*)  
**qed**

**context includes** *lifting-syntax* **begin**

**lemma** *weight-spmf-parametric* [*transfer-rule*]:  
*(rel-spmf A ==> (=)) weight-spmf weight-spmf*  
**by**(*simp add: rel-fun-def rel-spmf-weightD*)

**lemma** *lossless-spmf-parametric* [*transfer-rule*]:  
*(rel-spmf A ==> (=)) lossless-spmf lossless-spmf*  
**by**(*simp add: rel-fun-def lossless-spmf-def rel-spmf-weightD*)

**lemma** *UNIV-parametric-pred: rel-pred R UNIV UNIV*  
**by**(*auto intro!: rel-predI*)  
**end**

**lemma** *bind-spmf-spmf-of-set*:  
 $\bigwedge A. \llbracket \text{finite } A; A \neq \{\} \rrbracket \implies \text{bind-spmf (spmof-of-set } A) = \text{bind-pmf (pmf-of-set } A)$   
**by**(*simp add: spmf-of-set-def fun-eq-iff del: spmf-of-pmf-pmf-of-set*)

**lemma** *set-pmf-bind-spmf: set-pmf (bind-spmf M f) = set-pmf M ≫≡ map-option-set (set-pmf ∘ f)*  
**by**(*auto 4 3 simp add: bind-spmf-def split: option.splits intro: rev-bexI*)

**lemma** *set-pmf-spmf-of-set*:  
 $\text{set-pmf (spmof-of-set } A) = (\text{if finite } A \wedge A \neq \{\} \text{ then Some ' } A \text{ else } \{\text{None}\})$   
**by**(*simp add: spmf-of-set-def spmf-of-pmf-def del: spmf-of-pmf-pmf-of-set*)

**definition** *measure-measure-spmf* :: *'a spmf ⇒ 'a set ⇒ real*  
**where** [*simp*]: *measure-measure-spmf p = measure (measure-spmf p)*

**lemma** *measure-measure-spmf-parametric* [*transfer-rule*]:  
**includes** *lifting-syntax* **shows**  
*(rel-spmf A ==> rel-pred A ==> (=)) measure-measure-spmf measure-measure-spmf*  
**unfolding** *measure-measure-spmf-def[abs-def]* **by**(*rule measure-spmf-parametric*)

**lemma** *of-nat-le-one-cancel-iff* [*simp*]:  
**fixes** *n :: nat* **shows** *real n ≤ 1 ⟷ n ≤ 1*  
**by** *linarith*

```

lemma of-int-ceiling-less-add-one [simp]: of-int  $\lceil r \rceil < r + 1$ 
  by linarith

lemma lessThan-subset-Collect:  $\{.. $x$ \} \subseteq \text{Collect } P \longleftrightarrow (\forall y < x. P y)$ 
  by(auto simp add: lessThan-def)

lemma spmf-ub-tight:
  assumes ub:  $\bigwedge x. \text{spmf } p x \leq f x$ 
  and sum:  $(\int^+ x. f x \partial \text{count-space UNIV}) = \text{weight-spmf } p$ 
  shows  $\text{spmf } p x = f x$ 
proof -
  have [rule-format]:  $\forall x. f x \leq \text{spmf } p x$ 
  proof(rule ccontr)
    assume  $\neg ?thesis$ 
    then obtain  $x$  where  $x: \text{spmf } p x < f x$  by(auto simp add: not-le)
    have *:  $(\int^+ y. \text{ennreal } (f y) * \text{indicator } (- \{x\}) y \partial \text{count-space UNIV}) \neq \top$ 
    by(rule neq-top-trans[where  $y = \text{weight-spmf } p$ ], simp)(auto simp add: sum[symmetric])
    intro!: nn-integral-mono split: split-indicator

    have  $\text{weight-spmf } p = \int^+ y. \text{spmf } p y \partial \text{count-space UNIV}$ 
    by(simp add: nn-integral-spmf space-measure-spmf measure-spmf.emmeasure-eq-measure)
    also have  $\dots = (\int^+ y. \text{ennreal } (\text{spmf } p y) * \text{indicator } (- \{x\}) y \partial \text{count-space UNIV}) +$ 
       $(\int^+ y. \text{spmf } p y * \text{indicator } \{x\} y \partial \text{count-space UNIV})$ 
    by(subst nn-integral-add[symmetric])(auto intro!: nn-integral-cong split: split-indicator)
    also have  $\dots \leq (\int^+ y. \text{ennreal } (f y) * \text{indicator } (- \{x\}) y \partial \text{count-space UNIV})$ 
    +  $\text{spmf } p x$ 
    using ub by(intro add-mono nn-integral-mono)(auto split: split-indicator intro:
    ennreal-leI)
    also have  $\dots < (\int^+ y. \text{ennreal } (f y) * \text{indicator } (- \{x\}) y \partial \text{count-space UNIV})$ 
    +  $(\int^+ y. f y * \text{indicator } \{x\} y \partial \text{count-space UNIV})$ 
    using *  $x$  by(simp add: ennreal-less-iff)
    also have  $\dots = (\int^+ y. \text{ennreal } (f y) \partial \text{count-space UNIV})$ 
    by(subst nn-integral-add[symmetric])(auto intro!: nn-integral-cong split: split-indicator)
    also have  $\dots = \text{weight-spmf } p$  using sum by simp
    finally show False by simp
  qed
  from this[of  $x$ ] ub[of  $x$ ] show ?thesis by simp
qed

```

## 2 Probabilistic while loop

```

locale loop-spmf =
  fixes guard :: 'a  $\Rightarrow$  bool
  and body :: 'a  $\Rightarrow$  'a spmf
begin

context notes [[function-internals]] begin

```

**partial-function** (*spmf*) *while* :: 'a ⇒ 'a *spmf*  
**where** *while* *s* = (if *guard* *s* then *bind-spmf* (*body* *s*) *while* else *return-spmf* *s*)  
**end**

**lemma** *while-fixp-induct* [*case-names adm bottom step*]:  
**assumes** *spmf.admissible* *P*  
**and** *P* ( $\lambda$ *while*. *return-pmf* *None*)  
**and**  $\bigwedge$ *while'*. *P while'* ⇒ *P* ( $\lambda$ *s*. if *guard* *s* then *body* *s*  $\gg$  *while'* else *return-spmf* *s*)  
**shows** *P while*  
**using** *assms* **by**(*rule while.fixp-induct*)

**lemma** *while-simps*:  
 $\text{guard } s \implies \text{while } s = \text{bind-spmf } (\text{body } s) \text{ while}$   
 $\neg \text{guard } s \implies \text{while } s = \text{return-spmf } s$   
**by**(*rewrite while.simps; simp; fail*)**+**

**end**

**lemma** *while-spmf-parametric* [*transfer-rule*]:  
**includes** *lifting-syntax* **shows**  
 $((S \text{====} \text{=}) \text{====} \text{=} (S \text{====} \text{rel-spmf } S) \text{====} \text{=} S \text{====} \text{rel-spmf } S)$   
*loop-spmf.with* *loop-spmf.with*  
**unfolding** *loop-spmf.with-def*[*abs-def*]  
**apply**(*rule rel-funI*)  
**apply**(*rule rel-funI*)  
**apply**(*rule fixp-spmf-parametric*[*OF loop-spmf.with.mono loop-spmf.with.mono*])  
**subgoal premises** [*transfer-rule*] **by** *transfer-prover*  
**done**

**lemma** *loop-spmf-while-cong*:  
 $\llbracket \text{guard} = \text{guard}'; \bigwedge s. \text{guard}' s \implies \text{body } s = \text{body}' s \rrbracket$   
 $\implies \text{loop-spmf.with } \text{guard } \text{body} = \text{loop-spmf.with } \text{guard}' \text{body}'$   
**unfolding** *loop-spmf.with-def*[*abs-def*] **by**(*simp cong: if-cong*)

### 3 Rules for probabilistic termination

**context** *loop-spmf* **begin**

#### 3.1 0/1 termination laws

**lemma** *termination-0-1-immediate*:  
**assumes** *p*:  $\bigwedge s. \text{guard } s \implies \text{spmf } (\text{map-spmf } \text{guard } (\text{body } s)) \text{ False} \geq p$   
**and** *p-pos*:  $0 < p$   
**and** *lossless*:  $\bigwedge s. \text{guard } s \implies \text{lossless-spmf } (\text{body } s)$   
**shows** *lossless-spmf* (*while* *s*)  
**proof** –

```

have  $\forall s. \text{lossless-spmf } (\text{while } s)$ 
proof(rule ccontr)
  assume  $\neg ?thesis$ 
  then obtain  $s$  where  $s: \neg \text{lossless-spmf } (\text{while } s)$  by blast
  hence  $\text{True}: \text{guard } s$  by(simp add: while.simps split: if-split-asm)

from  $p[OF \text{ this}]$  have  $p\text{-le-1}: p \leq 1$  using pmf-le-1 by(rule order-trans)
have  $\text{new-bound}: p * (1 - k) + k \leq \text{weight-spmf } (\text{while } s)$ 
  if  $k: 0 \leq k \leq 1$  and  $k\text{-le}: \bigwedge s. k \leq \text{weight-spmf } (\text{while } s)$  for  $k \ s$ 
proof(cases guard s)
  case False
    have  $p * (1 - k) + k \leq 1 * (1 - k) + k$  using  $p\text{-le-1 } k$  by(intro
mult-right-mono add-mono; simp)
    also have  $\dots \leq 1$  by simp
    finally show  $?thesis$  using False by(simp add: while.simps)
  next
  case True
  let  $?M = \lambda s. \text{measure-spmf } (\text{body } s)$ 
  have  $\text{bounded}: |\int s''. \text{weight-spmf } (\text{while } s'') \partial ?M s'| \leq 1$  for  $s'$ 
    using integral-nonneg-AE[of  $\lambda s''. \text{weight-spmf } (\text{while } s'') ?M s'$ ]
  by(auto simp add: weight-spmf-nonneg weight-spmf-le-1 intro!: measure-spmf.nn-integral-le-const
integral-real-bounded)
  have  $p \leq \text{measure } (?M s) \{s'. \neg \text{guard } s'\}$  using  $p[OF \text{ True}]$ 
    by(simp add: spmf-conv-measure-spmf measure-map-spmf vimage-def)
  hence  $p * (1 - k) + k \leq \text{measure } (?M s) \{s'. \neg \text{guard } s'\} * (1 - k) + k$ 
    using  $k$  by(intro add-mono mult-right-mono)(simp-all)
  also have  $\dots = \int s'. \text{indicator } \{s'. \neg \text{guard } s'\} s' * (1 - k) + k \partial ?M s$ 
    using  $\text{True}$  by(simp add: ennreal-less-top-iff lossless lossless-weight-spmfD)
  also have  $\dots = \int s'. \text{indicator } \{s'. \neg \text{guard } s'\} s' + \text{indicator } \{s'. \text{guard } s'\}$ 
 $s' * k \partial ?M s$ 
    by(rule Bochner-Integration.integral-cong)(simp-all split: split-indicator)
  also have  $\dots = \int s'. \text{indicator } \{s'. \neg \text{guard } s'\} s' + \text{indicator } \{s'. \text{guard } s'\}$ 
 $s' * \int s''. k \partial ?M s' \partial ?M s$ 
    by(rule Bochner-Integration.integral-cong)(auto simp add: lossless lossless-weight-spmfD split: split-indicator)
  also have  $\dots \leq \int s'. \text{indicator } \{s'. \neg \text{guard } s'\} s' + \text{indicator } \{s'. \text{guard } s'\}$ 
 $s' * \int s''. \text{weight-spmf } (\text{while } s'') \partial ?M s' \partial ?M s$ 
    using  $k$  bounded
  by(intro integral-mono integrable-add measure-spmf.integrable-const-bound[where
 $B=1$ ]add-mono mult-left-mono)
  (simp-all add: weight-spmf-nonneg weight-spmf-le-1 mult-le-one k-le split: split-indicator)
  also have  $\dots = \int s'. (\text{if } \neg \text{guard } s' \text{ then } 1 \text{ else } \int s''. \text{weight-spmf } (\text{while } s''))$ 
 $\partial ?M s' \partial ?M s$ 
    by(rule Bochner-Integration.integral-cong)(simp-all split: split-indicator)
  also have  $\dots = \int s'. \text{weight-spmf } (\text{while } s') \partial \text{measure-spmf } (\text{body } s)$ 
by(rule Bochner-Integration.integral-cong; simp add: while.simps weight-bind-spmf
o-def)
  also have  $\dots = \text{weight-spmf } (\text{while } s)$  using  $\text{True}$ 

```

```

    by(simp add: while.simps weight-bind-spmf o-def)
  finally show ?thesis .
qed

define k where k  $\equiv$  INF s. weight-spmf (while s)
define k' where k'  $\equiv$  p * (1 - k) + k
from s have weight-spmf (while s) < 1
  using weight-spmf-le-1 [of while s] by(simp add: lossless-spmf-def)
then have k < 1
  unfolding k-def by(rewrite cINF-less-iff)(auto intro!: bdd-belowI2 weight-spmf-nonneg)

have 0  $\leq$  k unfolding k-def by(auto intro: cINF-greatest simp add: weight-spmf-nonneg)
moreover from <k < 1> have k  $\leq$  1 by simp
moreover have k  $\leq$  weight-spmf (while s) for s unfolding k-def
  by(rule cINF-lower)(auto intro!: bdd-belowI2 weight-spmf-nonneg)
ultimately have  $\bigwedge$ s. k'  $\leq$  weight-spmf (while s)
  unfolding k'-def by(rule new-bound)
hence k'  $\leq$  k unfolding k-def by(auto intro: cINF-greatest)
also have k < k' using p-pos <k < 1> by(auto simp add: k'-def)
finally show False by simp
qed
thus ?thesis by blast
qed

primrec iter :: nat  $\Rightarrow$  'a  $\Rightarrow$  'a spmf
where
  iter 0 s = return-spmf s
| iter (Suc n) s = (if guard s then bind-spmf (body s) (iter n) else return-spmf s)

lemma iter-unguarded [simp]:  $\neg$  guard s  $\implies$  iter n s = return-spmf s
  by(induction n) simp-all

lemma iter-bind-iter: bind-spmf (iter m s) (iter n) = iter (m + n) s
  by(induction m arbitrary: s) simp-all

lemma iter-Suc2: iter (Suc n) s = bind-spmf (iter n s) ( $\lambda$ s. if guard s then body s else return-spmf s)
  using iter-bind-iter [of n s 1, symmetric]
  by(simp del: iter.simps)(rule bind-spmf-cong; simp cong: bind-spmf-cong)

lemma lossless-iter: ( $\bigwedge$ s. guard s  $\implies$  lossless-spmf (body s))  $\implies$  lossless-spmf (iter n s)
  by(induction n arbitrary: s) simp-all

lemma iter-mono-emeasure1:
  emeasure (measure-spmf (iter n s)) {s.  $\neg$  guard s}  $\leq$  emeasure (measure-spmf (iter (Suc n) s)) {s.  $\neg$  guard s}
  (is ?lhs  $\leq$  ?rhs)
proof(cases guard s)

```



```

case True
have  $?lhs = \text{emeasure (measure-spmf (bind-spmf (iter n s) return-spmf)) \{s. \neg \text{guard } s\}}$  by simp
also have  $\dots = \int^+ s'. \text{emeasure (measure-spmf (return-spmf s')) \{s. \neg \text{guard } s\}} \partial\text{measure-spmf (iter n s)}$ 
by(simp del: bind-return-spmf add: measure-spmf-bind o-def emeasure-bind[where  $N=\text{measure-spmf -}$ ] space-measure-spmf Pi-def space-subprob-algebra)
also have  $\dots \leq \int^+ s'. \text{emeasure (measure-spmf (if guard s' then body s' else return-spmf s')) \{s. \neg \text{guard } s\}} \partial\text{measure-spmf (iter n s)}$ 
by(rule nn-integral-mono)(simp add: measure-spmf-return-spmf)
also have  $\dots = ?rhs$ 
by(simp add: iter-Suc2 measure-spmf-bind o-def emeasure-bind[where  $N=\text{measure-spmf -}$ ] space-measure-spmf Pi-def space-subprob-algebra del: iter.simps)
finally show ?thesis .
qed simp

```

**lemma** *weight-while-conv-iter:*

```

 $\text{weight-spmf (while s)} = (\text{SUP } n. \text{measure (measure-spmf (iter n s)) \{s. \neg \text{guard } s\}})$ 
(is  $?lhs = ?rhs$ )
proof(rule antisym)
have  $\text{emeasure (measure-spmf (while s)) UNIV} \leq (\text{SUP } n. \text{emeasure (measure-spmf (iter n s)) \{s. \neg \text{guard } s\}})$ 
(is  $\leq (\text{SUP } n. ?f n s)$ )
proof(induction arbitrary: s rule: while-fixp-induct)
case adm show ?case by simp
case bottom show ?case by simp
case (step while')
show ?case (is ?lhs'  $\leq$  ?rhs')
proof(cases guard s)
case True
have inc: incseq ?f by(rule incseq-SucI le-funI iter-mono-emeasure1)+

from True have  $?lhs' = \int^+ s'. \text{emeasure (measure-spmf (while' s')) UNIV} \partial\text{measure-spmf (body s)}$ 
by(simp add: measure-spmf-bind o-def emeasure-bind[where  $N=\text{measure-spmf -}$ ] space-measure-spmf Pi-def space-subprob-algebra)
also have  $\dots \leq \int^+ s'. (\text{SUP } n. ?f n s') \partial\text{measure-spmf (body s)}$ 
by(rule nn-integral-mono)(rule step.IH)
also have  $\dots = (\text{SUP } n. \int^+ s'. ?f n s' \partial\text{measure-spmf (body s)})$  using inc
by(subst nn-integral-monotone-convergence-SUP) simp-all
also have  $\dots = (\text{SUP } n. ?f (\text{Suc } n) s)$  using True
by(simp add: measure-spmf-bind o-def emeasure-bind[where  $N=\text{measure-spmf -}$ ] space-measure-spmf Pi-def space-subprob-algebra)
also have  $\dots \leq (\text{SUP } n. ?f n s)$ 
by(rule SUP-mono)(auto intro: exI[where  $x=\text{Suc -}$ ])
finally show ?thesis .
next
case False

```

```

then have ?lhs' = emeasure (measure-spmf (iter 0 s)) {s. ¬ guard s}
  by(simp add: measure-spmf-return-spmf)
also have ⟨... ≤ ?rhs'⟩ by(rule SUP-upper) simp
finally show ?thesis .
qed
qed
also have ... = ennreal (SUP n. measure (measure-spmf (iter n s)) {s. ¬ guard
s})
  by(subst ennreal-SUP)(fold measure-spmf.emeasure-eq-measure, auto simp add:
not-less measure-spmf.subprob-emeasure-le-1 intro!: exI[where x=1])
  also have 0 ≤ (SUP n. measure (measure-spmf (iter n s)) {s. ¬ guard s})
    by(rule cSUP-upper2)(auto intro!: bdd-aboveI[where M=1] simp add: mea-
sure-spmf.subprob-measure-le-1)
  ultimately show ?lhs ≤ ?rhs by(simp add: measure-spmf.emeasure-eq-measure
space-measure-spmf)

show ?rhs ≤ ?lhs
proof(rule cSUP-least)
  show measure (measure-spmf (iter n s)) {s. ¬ guard s} ≤ weight-spmf (while
s) (is ?f n s ≤ -) for n
  proof(induction n arbitrary: s)
    case 0 show ?case
      by(simp add: measure-spmf-return-spmf measure-return while-simps split:
split-indicator)
    next
      case (Suc n)
      show ?case
      proof(cases guard s)
        case True
          have ?f (Suc n) s = ∫+ s'. ?f n s' ∂measure-spmf (body s)
            using True unfolding measure-spmf.emeasure-eq-measure[symmetric]
          by(simp add: measure-spmf-bind o-def emeasure-bind[where N=measure-spmf
-] space-measure-spmf Pi-def space-subprob-algebra)
          also have ... ≤ ∫+ s'. weight-spmf (while s') ∂measure-spmf (body s)
            by(rule nn-integral-mono ennreal-leI Suc.IH)+
          also have ... = weight-spmf (while s)
            using True unfolding measure-spmf.emeasure-eq-measure[symmetric]
space-measure-spmf
          by(simp add: while-simps measure-spmf-bind o-def emeasure-bind[where
N=measure-spmf -] space-measure-spmf Pi-def space-subprob-algebra)
          finally show ?thesis by(simp)
        next
          case False then show ?thesis
            by(simp add: measure-spmf-return-spmf measure-return while-simps split:
split-indicator)
          qed
        qed
      qed simp
    qed

```

**lemma** *termination-0-1*:

**assumes**  $p: \bigwedge s. \text{guard } s \implies p \leq \text{weight-spmf } (\text{while } s)$   
**and**  $p\text{-pos}: 0 < p$   
**and**  $\text{lossless}: \bigwedge s. \text{guard } s \implies \text{lossless-spmf } (\text{body } s)$   
**shows**  $\text{lossless-spmf } (\text{while } s)$   
**unfolding**  $\text{lossless-spmf-def}$   
**proof**(*rule antisym*)  
**let**  $?X = \{s. \neg \text{guard } s\}$   
**show**  $\text{weight-spmf } (\text{while } s) \leq 1$  **by**(*rule weight-spmf-le-1*)

**define**  $p'$  **where**  $p' \equiv p / 2$   
**have**  $p'\text{-pos}: p' > 0$  **and**  $p' < p$  **using**  $p\text{-pos}$  **by**(*simp-all add: p'-def*)

**have**  $\exists n. p' < \text{measure } (\text{measure-spmf } (\text{iter } n \ s)) \ ?X$  **if**  $\text{guard } s$  **for**  $s$  **using**  
 $p[\text{OF that}] \langle p' < p \rangle$   
**unfolding**  $\text{weight-while-conv-iter}$   
**by**(*subst (asm) le-cSUP-iff*)(*auto intro!: measure-spmf.subprob-measure-le-1*)  
**then obtain**  $N$  **where**  $p': p' \leq \text{measure } (\text{measure-spmf } (\text{iter } (N \ s) \ s)) \ ?X$  **if**  
 $\text{guard } s$  **for**  $s$   
**using**  $p$  **by**  $\text{atomize-elim}$ (*rule choice, force dest: order.strict-implies-order*)

**interpret**  $\text{fuse}: \text{loop-spmf guard } \lambda s. \text{iter } (N \ s) \ s .$

**have**  $1 = \text{weight-spmf } (\text{fuse.while } s)$   
**by**(*rule lossless-weight-spmfD[symmetric]*)  
(*rule fuse.termination-0-1-immediate; auto simp add: spmf-map vimage-def*)  
*intro: p' p'-pos lossless-iter lossless*  
**also have**  $\dots \leq (\bigsqcup n. \text{measure } (\text{measure-spmf } (\text{iter } n \ s)) \ ?X)$   
**unfolding**  $\text{fuse.weight-while-conv-iter}$   
**proof**(*rule cSUP-least*)  
**fix**  $n$   
**have**  $\text{emeasure } (\text{measure-spmf } (\text{fuse.iter } n \ s)) \ ?X \leq (\text{SUP } n. \text{emeasure } (\text{measure-spmf } (\text{iter } n \ s)) \ ?X)$   
**proof**(*induction n arbitrary: s*)  
**case**  $0$  **show**  $?case$  **by**(*auto intro!: SUP-upper2[where i=0]*)  
**next**  
**case**  $(\text{Suc } n)$   
**have**  $\text{inc}: \text{incseq } (\lambda n \ s'. \text{emeasure } (\text{measure-spmf } (\text{iter } n \ s')) \ ?X)$   
**by**(*rule incseq-SucI le-funI iter-mono-emeasure1*) $+$

**have**  $\text{emeasure } (\text{measure-spmf } (\text{fuse.iter } (\text{Suc } n) \ s)) \ ?X = \text{emeasure } (\text{measure-spmf } (\text{iter } (N \ s) \ s) \gg= \text{fuse.iter } n) \ ?X$   
**by**  $\text{simp}$   
**also have**  $\dots = \int^+ s'. \text{emeasure } (\text{measure-spmf } (\text{fuse.iter } n \ s')) \ ?X \ \partial \text{measure-spmf } (\text{iter } (N \ s) \ s)$   
**by**(*simp add: measure-spmf-bind o-def emeasure-bind[where N=measure-spmf -] space-measure-spmf Pi-def space-subprob-algebra*)  
**also have**  $\dots \leq \int^+ s'. (\text{SUP } n. \text{emeasure } (\text{measure-spmf } (\text{iter } n \ s')) \ ?X)$

$\partial$ measure-spmf (iter (N s) s)  
**by**(rule nn-integral-mono Suc.IH)+  
**also have** ... = (SUP n.  $\int^+ s'. \text{emeasure (measure-spmf (iter n s')) ?X}$ )  
 $\partial$ measure-spmf (iter (N s) s)  
**by**(rule nn-integral-monotone-convergence-SUP[OF inc]) simp  
**also have** ... = (SUP n.  $\text{emeasure (measure-spmf (bind-spmf (iter (N s) s) (iter n))) ?X}$ )  
**by**(simp add: measure-spmf-bind o-def emeasure-bind[**where** N=measure-spmf -] space-measure-spmf Pi-def space-subprob-algebra)  
**also have** ... = (SUP n.  $\text{emeasure (measure-spmf (iter (N s + n) s)) ?X}$ )  
**by**(simp add: iter-bind-iter)  
**also have** ...  $\leq$  (SUP n.  $\text{emeasure (measure-spmf (iter n s)) ?X}$ ) **by**(rule SUP-mono) auto  
**finally show** ?case .  
**qed**  
**also have** ... = ennreal (SUP n.  $\text{measure (measure-spmf (iter n s)) ?X}$ )  
**by**(subst ennreal-SUP)(fold measure-spmf.emeasure-eq-measure, auto simp add: not-less measure-spmf.subprob-emeasure-le-1 intro!: exI[**where** x=1])  
**also have**  $0 \leq$  (SUP n.  $\text{measure (measure-spmf (iter n s)) ?X}$ )  
**by**(rule cSUP-upper2)(auto intro!: bdd-aboveI[**where** M=1] simp add: measure-spmf.subprob-measure-le-1)  
**ultimately show**  $\text{measure (measure-spmf (fuse.iter n s)) ?X} \leq \dots$   
**by**(simp add: measure-spmf.emeasure-eq-measure)  
**qed simp**  
**finally show**  $1 \leq \text{weight-spmf (while s) unfolding weight-while-conv-iter .}$   
**qed**

end

**lemma** termination-0-1-immediate-invar:

**fixes**  $I :: 's \Rightarrow \text{bool}$   
**assumes**  $p: \bigwedge s. \llbracket \text{guard } s; I s \rrbracket \Longrightarrow \text{spm}f (\text{map-spm}f \text{guard (body } s)) \text{False} \geq p$   
**and**  $p\text{-pos}: 0 < p$   
**and**  $\text{lossless}: \bigwedge s. \llbracket \text{guard } s; I s \rrbracket \Longrightarrow \text{lossless-spm}f (\text{body } s)$   
**and**  $\text{invar}: \bigwedge s s'. \llbracket s' \in \text{set-spm}f (\text{body } s); I s; \text{guard } s \rrbracket \Longrightarrow I s'$   
**and**  $I: I s$   
**shows**  $\text{lossless-spm}f (\text{loop-spm}f.\text{while guard body } s)$   
**including** *lifting-syntax*  
**proof** –  
{ **assume**  $\exists (\text{Rep} :: 's' \Rightarrow 's) \text{Abs. type-definition Rep Abs } \{s. I s\}$   
**then obtain**  $\text{Rep} :: 's' \Rightarrow 's$  **and**  $\text{Abs}$  **where**  $\text{td: type-definition Rep Abs } \{s. I s\}$  **by** *blast*  
**then interpret**  $\text{td: type-definition Rep Abs } \{s. I s\}$  .  
**define**  $\text{cr}$  **where**  $\text{cr} \equiv \lambda x y. x = \text{Rep } y$   
**have** [*transfer-rule*]:  $\text{bi-unique cr right-total cr using td cr-def by (rule type-def-bi-unique typedef-right-total)}$ +  
**have** [*transfer-domain-rule*]:  $\text{Domain } p \text{ cr} = I$  **using** *type-definition-Domain*[OF *td cr-def*] **by** *simp*

```

define guard' where guard'  $\equiv$  (Rep  $\dashrightarrow$  id) guard
  have [transfer-rule]: (cr  $\equiv\equiv\equiv$   $\Rightarrow$  (=)) guard guard' by(simp add: rel-fun-def
cr-def guard'-def)
define body1 where body1  $\equiv$   $\lambda s$ . if guard s then body s else return-pmf None
define body1' where body1'  $\equiv$  (Rep  $\dashrightarrow$  map-spmf Abs) body1
have [transfer-rule]: (cr  $\equiv\equiv\equiv$   $\Rightarrow$  rel-spmf cr) body1 body1'
by(auto simp add: rel-fun-def body1'-def body1-def cr-def spmf-rel-map td.Rep[simplified])
invar td.Abs-inverse intro!: rel-spmf-refI)
define s' where s'  $\equiv$  Abs s
have [transfer-rule]: cr s s' by(simp add: s'-def cr-def I td.Abs-inverse)

have  $\bigwedge s$ . guard' s  $\implies$  p  $\leq$  spmf (map-spmf guard' (body1' s)) False
  by(transfer fixing: p)(simp add: body1-def p)
moreover note p-pos
moreover have  $\bigwedge s$ . guard' s  $\implies$  lossless-spmf (body1' s) by transfer(simp
add: lossless body1-def)
  ultimately have lossless-spmf (loop-spmf.while guard' body1' s') by(rule
loop-spmf.termination-0-1-immediate)
  hence lossless-spmf (loop-spmf.while guard body1 s) by transfer }
from this[cancel-type-definition] I show ?thesis by(auto cong: loop-spmf-while-cong)
qed

```

**lemma** *termination-0-1-invar*:

```

fixes I :: 's  $\Rightarrow$  bool
assumes p:  $\bigwedge s$ .  $\llbracket$  guard s; I s  $\rrbracket \implies$  p  $\leq$  weight-spmf (loop-spmf.while guard body
s)
  and p-pos: 0 < p
  and lossless:  $\bigwedge s$ .  $\llbracket$  guard s; I s  $\rrbracket \implies$  lossless-spmf (body s)
  and invar:  $\bigwedge s$  s'.  $\llbracket$  s' ∈ set-spmf (body s); I s; guard s  $\rrbracket \implies$  I s'
  and I: I s
shows lossless-spmf (loop-spmf.while guard body s)
including lifting-syntax
proof–
  { assume  $\exists$  (Rep :: 's'  $\Rightarrow$  's) Abs. type-definition Rep Abs {s. I s}
    then obtain Rep :: 's'  $\Rightarrow$  's and Abs where td: type-definition Rep Abs {s. I
s} by blast
    then interpret td: type-definition Rep Abs {s. I s} .
    define cr where cr  $\equiv$   $\lambda x$  y. x = Rep y
    have [transfer-rule]: bi-unique cr right-total cr using td cr-def by(rule type-
def-bi-unique typedef-right-total)+
    have [transfer-domain-rule]: Domain cr = I using type-definition-Domain p[OF
td cr-def] by simp

```

```

define guard' where guard'  $\equiv$  (Rep  $\dashrightarrow$  id) guard
  have [transfer-rule]: (cr  $\equiv\equiv\equiv$   $\Rightarrow$  (=)) guard guard' by(simp add: rel-fun-def
cr-def guard'-def)
define body1 where body1  $\equiv$   $\lambda s$ . if guard s then body s else return-pmf None
define body1' where body1'  $\equiv$  (Rep  $\dashrightarrow$  map-spmf Abs) body1
have [transfer-rule]: (cr  $\equiv\equiv\equiv$   $\Rightarrow$  rel-spmf cr) body1 body1'

```

```

by(auto simp add: rel-fun-def body1'-def body1-def cr-def spmf-rel-map td.Rep[simplified]
invar td.Abs-inverse intro!: rel-spmf-refI)
define s' where s' ≡ Abs s
have [transfer-rule]: cr s s' by(simp add: s'-def cr-def I td.Abs-inverse)

interpret loop-spmf guard' body1' .

note UNIV-parametric-pred[transfer-rule]
have  $\bigwedge s. \text{guard}' s \implies p \leq \text{weight-spmf } (\text{while } s)$ 
unfolding measure-measure-spmf-def[symmetric] space-measure-spmf
by(transfer fixing: p)(simp add: body1-def p[simplified space-measure-spmf])
cong: loop-spmf-while-cong)
moreover note p-pos
moreover have  $\bigwedge s. \text{guard}' s \implies \text{lossless-spmf } (\text{body1}' s)$  by transfer(simp
add: lossless body1-def)
ultimately have lossless-spmf (while s') by(rule termination-0-1)
hence lossless-spmf (loop-spmf.while guard body1 s) by transfer }
from this[cancel-type-definition] I show ?thesis by(auto cong: loop-spmf-while-cong)
qed

```

### 3.2 Variant rule

**context** *loop-spmf begin*

**lemma** *termination-variant:*

```

fixes bound :: nat
assumes bound:  $\bigwedge s. \text{guard } s \implies f s \leq \text{bound}$ 
and step:  $\bigwedge s. \text{guard } s \implies p \leq \text{spmfs } (\lambda s'. f s' < f s) (\text{body } s)$  True
and p-pos:  $0 < p$ 
and lossless:  $\bigwedge s. \text{guard } s \implies \text{lossless-spmfs } (\text{body } s)$ 
shows lossless-spmfs (while s)
proof –
define p' and n where p' ≡ min p 1 and n ≡ bound + 1
have p'-pos:  $0 < p'$  and p'-le-1:  $p' \leq 1$ 
and step':  $\text{guard } s \implies p' \leq \text{measure } (\text{measure-spmfs } (\text{body } s)) \{s'. f s' < f s\}$ 
for s
using p-pos step[of s] by(simp-all add: p'-def spmfs-map vimage-def)
have p' ^ n ≤ weight-spmfs (while s) if f s < n for s using that
proof(induction n arbitrary: s)
case 0 thus ?case by simp
next
case (Suc n)
show ?case
proof(cases guard s)
case False
hence weight-spmfs (while s) = 1 by(simp add: while.simps)
thus ?thesis using p'-le-1 p-pos
by simp(meson less-eq-real-def mult-le-one p'-pos power-le-one zero-le-power)
next

```

```

case True
let  $?M = \text{measure-spmf } (\text{body } s)$ 
have  $p' \wedge \text{Suc } n \leq (\int s'. \text{indicator } \{s'. f s' < f s\} s' \partial ?M) * p' \wedge n$ 
  using step'[OF True] p'-pos by (simp add: mult-right-mono)
also have  $\dots = (\int s'. \text{indicator } \{s'. f s' < f s\} s' * p' \wedge n \partial ?M)$  by simp
also have  $\dots \leq (\int s'. \text{indicator } \{s'. f s' < f s\} s' * \text{weight-spmf } (\text{while } s'))$ 
 $\partial ?M)$ 
  using Suc.premis p'-le-1 p'-pos
  by (intro integral-mono) (auto simp add: Suc.IH power-le-one weight-spmf-le-1)
split: split-indicator intro!: measure-spmf.integrable-const-bound[where B=1])
  also have  $\dots \leq \dots + (\int s'. \text{indicator } \{s'. f s' \geq f s\} s' * \text{weight-spmf } (\text{while } s'))$ 
 $\partial ?M)$ 
  by (simp add: integral-nonneg-AE weight-spmf-nonneg)
  also have  $\dots = \int s'. \text{weight-spmf } (\text{while } s') \partial ?M$ 
  by (subst Bochner-Integration.integral-add[symmetric])
  (auto intro!: Bochner-Integration.integral-cong measure-spmf.integrable-const-bound[where
B=1] weight-spmf-le-1 split: split-indicator)
  also have  $\dots = \text{weight-spmf } (\text{while } s)$ 
  using True by (subst (1 2) while.simps) (simp add: weight-bind-spmf o-def)
  finally show ?thesis .
qed
qed
moreover have  $0 < p' \wedge n$  using p'-pos by simp
ultimately show ?thesis using lossless
proof (rule termination-0-1-invar)
  show  $f s < n$  if guard s guard  $s \longrightarrow f s < n$  for  $s$  using that by simp
  show guard s  $\longrightarrow f s < n$  using bound[of s] by (auto simp add: n-def)
  show guard s'  $\longrightarrow f s' < n$  for  $s'$  using bound[of s'] by (clarsimp simp add:
n-def)
qed
qed
end

lemma termination-variant-invar:
  fixes bound :: nat and I :: 's  $\Rightarrow$  bool
  assumes bound:  $\bigwedge s. \llbracket \text{guard } s; I s \rrbracket \Longrightarrow f s \leq \text{bound}$ 
  and step:  $\bigwedge s. \llbracket \text{guard } s; I s \rrbracket \Longrightarrow p \leq \text{spmfmf } (\text{map-spmfmf } (\lambda s'. f s' < f s) (\text{body } s)) \text{ True}$ 
  and p-pos:  $0 < p$ 
  and lossless:  $\bigwedge s. \llbracket \text{guard } s; I s \rrbracket \Longrightarrow \text{lossless-spmfmf } (\text{body } s)$ 
  and invar:  $\bigwedge s s'. \llbracket s' \in \text{set-spmfmf } (\text{body } s); I s; \text{guard } s \rrbracket \Longrightarrow I s'$ 
  and I: I s
  shows lossless-spmfmf (loop-spmfmf.while guard body s)
  including lifting-syntax
proof –
  { assume  $\exists (\text{Rep} :: 's' \Rightarrow 's)$  Abs. type-definition Rep Abs {s. I s}
    then obtain Rep :: 's'  $\Rightarrow$  's and Abs where td: type-definition Rep Abs {s. I s}
    by blast
  }

```

```

then interpret td: type-definition Rep Abs {s. I s} .
define cr where cr  $\equiv \lambda x y. x = Rep\ y$ 
have [transfer-rule]: bi-unique cr right-total cr using td cr-def by(rule type-def-bi-unique typedef-right-total)+
have [transfer-domain-rule]: Domainp cr = I using type-definition-Domainp[OF td cr-def] by simp

define guard' where guard'  $\equiv (Rep\ \text{---} > id)\ guard$ 
have [transfer-rule]: (cr == => (=)) guard guard' by(simp add: rel-fun-def cr-def guard'-def)
define body1 where body1  $\equiv \lambda s. \text{if guard } s \text{ then body } s \text{ else return-pmf None}$ 
define body1' where body1'  $\equiv (Rep\ \text{---} > map\ \text{spmfs}\ Abs)\ body1$ 
have [transfer-rule]: (cr == => rel-spmf cr) body1 body1'
by (auto simp add: rel-fun-def body1'-def body1-def cr-def spmf-rel-map td.Rep[simplified] invar td.Abs-inverse intro!: rel-spmf-reflI)
define s' where s'  $\equiv Abs\ s$ 
have [transfer-rule]: cr s s' by(simp add: s'-def cr-def I td.Abs-inverse)
define f' where f'  $\equiv (Rep\ \text{---} > id)\ f$ 
have [transfer-rule]: (cr == => (=)) f f' by(simp add: rel-fun-def cr-def f'-def)

have  $\bigwedge s. guard'\ s \implies f'\ s \leq bound$  by (transfer fixing: bound)(rule bound)
moreover have  $\bigwedge s. guard'\ s \implies p \leq \text{spmfs}\ (map\ \text{spmfs}\ (\lambda s'. f'\ s' < f'\ s))$ 
(body1' s) True
by (transfer fixing: p)(simp add: step body1-def)
note this p-pos
moreover have  $\bigwedge s. guard'\ s \implies \text{lossless-spmfs}\ (body1'\ s)$ 
by transfer(simp add: body1-def lossless)
ultimately have lossless-spmfs (loop-spmfs.while guard' body1' s') by (rule loop-spmfs.termination-variant)
hence lossless-spmfs (loop-spmfs.while guard body1 s) by transfer }
from this[cancel-type-definition] I show ?thesis by (auto cong: loop-spmfs-while-cong)
qed

end

```

## 4 Distributions built from coin flips

### 4.1 The Bernoulli distribution

**theory** *Bernoulli* **imports** *HOL-Probability.Probability* **begin**

**lemma** *zero-lt-num* [*simp*]:  $0 < (\text{numeral } n :: - :: \{\text{canonically-ordered-monoid-add, semiring-char-0}\})$

**by** *(metis not-gr-zero zero-neq-numeral)*

**lemma** *ennreal-mult-numeral*:  $\text{ennreal } x * \text{numeral } n = \text{ennreal } (x * \text{numeral } n)$

**by** *(simp add: ennreal-mult')*

**lemma** *one-plus-ennreal*:  $0 \leq x \implies 1 + \text{ennreal } x = \text{ennreal } (1 + x)$



by *simp*

We define the Bernoulli distribution as a least fixpoint instead of a loop because this avoids the need to add a condition flag to the distribution, which we would have to project out at the end again. As the direct termination proof is so simple, we do not bother to prove it equivalent to a while loop.

```
partial-function (spmf) bernoulli :: real ⇒ bool spmf where
  bernoulli p = do {
    b ← coin-spmf;
    if b then return-spmf (p ≥ 1 / 2)
    else if p < 1 / 2 then bernoulli (2 * p)
    else bernoulli (2 * p - 1)
  }
```

**lemma** pmf-bernoulli-None: pmf (bernoulli p) None = 0

**proof** –

**have** ereal (pmf (bernoulli p) None) ≤ (INF n∈UNIV. ereal (1 / 2 ^ n))

**proof**(rule INF-greatest)

**show** ereal (pmf (bernoulli p) None) ≤ ereal (1 / 2 ^ n) **for** n

**proof**(induction n arbitrary: p)

**case** (Suc n)

**show** ?case **using** Suc.IH[of 2 \* p] Suc.IH[of 2 \* p - 1]

**by**(subst bernoulli.simps)(simp add: UNIV-bool max-def field-simps spmf-of-pmf-pmf-of-set[symmetric]

pmf-bind-pmf-of-set ennreal-pmf-bind nn-integral-pmf-of-set del: spmf-of-pmf-pmf-of-set)

**qed**(simp add: pmf-le-1)

**qed**

**also have** ... = ereal 0

**proof**(rule LIMSEQ-unique)

**show** (λn. ereal (1 / 2 ^ n)) → ... **by**(rule LIMSEQ-INF)(simp add: field-simps decseq-SucI)

**show** (λn. ereal (1 / 2 ^ n)) → ereal 0 **by**(simp add: LIMSEQ-divide-realpow-zero)

**qed**

**finally show** ?thesis **by** simp

**qed**

**lemma** lossless-bernoulli [simp]: lossless-spmf (bernoulli p)

**by**(simp add: lossless-iff-pmf-None pmf-bernoulli-None)

**lemma** [simp]: **assumes** 0 ≤ p p ≤ 1

**shows** bernoulli-True: spmf (bernoulli p) True = p (**is** ?True)

**and** bernoulli-False: spmf (bernoulli p) False = 1 - p (**is** ?False)

**proof** –

{ **have** ennreal (spmf (bernoulli p) b) ≤ ennreal (if b then p else 1 - p) **for** b **using** assms

**proof**(induction arbitrary: p rule: bernoulli.fixp-induct[case-names adm bottom step])

**case** adm **show** ?case **by**(rule cont-intro)+

**next**

**case** (step bernoulli' p)

**show** *?case using step.premis step.IH[of 2 \* p] step.IH[of 2 \* p - 1]*  
**by**(*auto simp add: UNIV-bool max-def divide-le-posI-ennreal ennreal-mult-numeral numeral-mult-ennreal field-simps pmf-of-pmf-pmf-of-set[symmetric] ennreal-pmf-bind nn-integral-pmf-of-set one-plus-ennreal simp del: pmf-of-pmf-pmf-of-set ennreal-plus*)  
**qed simp }**  
**note** *this[of True] this[of False]*  
**moreover have** *pmf (bernoulli p) True + pmf (bernoulli p) False = 1*  
**by**(*simp add: pmf-False-conv-True*)  
**ultimately show** *?True ?False using assms by(auto simp add: ennreal-le-iff2)*  
**qed**

**lemma** *bernoulli-neg [simp]:*

**assumes** *p < 0*  
**shows** *bernoulli p = return-spmf False*  
**proof** –  
**from** *assms have ord-spmf (=) (bernoulli p) (return-spmf False)*  
**proof**(*induction arbitrary: p rule: bernoulli.fixp-induct[case-names adm bottom step]*)  
**case** (*step bernoulli' p*)  
**show** *?case using step.premis step.IH[of 2 \* p]*  
**by**(*auto simp add: ord-spmf-return-spmf2 set-bind-spmf bind-UNION field-simps*)  
**qed simp-all**  
**from** *ord-spmf-eq-leD[OF this, of True] have pmf (bernoulli p) True = 0 by simp*  
**moreover then have** *pmf (bernoulli p) False = 1 by(simp add: pmf-False-conv-True)*  
**ultimately show** *?thesis by(auto intro: pmf-eqI split: split-indicator)*  
**qed**

**lemma** *bernoulli-pos [simp]:*

**assumes** *1 ≤ p*  
**shows** *bernoulli p = return-spmf True*  
**proof** –  
**from** *assms have ord-spmf (=) (bernoulli p) (return-spmf True)*  
**proof**(*induction arbitrary: p rule: bernoulli.fixp-induct[case-names adm bottom step]*)  
**case** (*step bernoulli' p*)  
**show** *?case using step.premis step.IH[of 2 \* p - 1]*  
**by**(*auto simp add: ord-spmf-return-spmf2 set-bind-spmf bind-UNION field-simps*)  
**qed simp-all**  
**from** *ord-spmf-eq-leD[OF this, of False] have pmf (bernoulli p) False = 0 by simp*  
**moreover then have** *pmf (bernoulli p) True = 1 by(simp add: pmf-False-conv-True)*  
**ultimately show** *?thesis by(auto intro: pmf-eqI split: split-indicator)*  
**qed**

**context** **begin interpretation** *pmf-as-function .*

**lemma** *bernoulli-eq-bernoulli-pmf:*

*bernoulli p = pmf-of-pmf (bernoulli-pmf p)*  
**by**(*rule pmf-eqI; simp*)(*transfer; auto simp add: max-def min-def*)

end

end

## 4.2 The geometric distribution

**theory** *Geometric imports*

*Bernoulli*

*While-SPMF*

**begin**

We define the geometric distribution as a least fixpoint, which is more elegant than as a loop. To prove probabilistic termination, we prove it equivalent to a loop and use the proof rules for probabilistic termination.

**context notes** *[[function-internals]] begin*

**partial-function** (*spmf*) *geometric-spmf* :: *real*  $\Rightarrow$  *nat* *spmf* **where**

*geometric-spmf* *p* = **do** {

*b*  $\leftarrow$  *bernoulli* *p*;

**if** *b* **then** *return-spmf* 0 **else** *map-spmf* ((+) 1) (*geometric-spmf* *p*)

}

**end**

**lemma** *geometric-spmf-fixp-induct* [*case-names adm bottom step*]:

**assumes** *spmf.admissible* *P*

**and** *P* ( $\lambda$ *geometric-spmf*. *return-pmf* None)

**and**  $\bigwedge$ *geometric-spmf'*. *P* *geometric-spmf'*  $\Longrightarrow$  *P* ( $\lambda$ *p*. *bernoulli* *p*  $\ggg$  ( $\lambda$ *b*. **if** *b* **then** *return-spmf* 0 **else** *map-spmf* ((+) 1) (*geometric-spmf'* *p*)))

**shows** *P* *geometric-spmf*

**using** *assms* **by**(*rule* *geometric-spmf.fixp-induct*)

**lemma** *spmf-geometric-nonpos*:  $p \leq 0 \Longrightarrow$  *geometric-spmf* *p* = *return-pmf* None

**by**(*induction rule: geometric-spmf-fixp-induct*) *simp-all*

**lemma** *spmf-geometric-ge-1*:  $1 \leq p \Longrightarrow$  *geometric-spmf* *p* = *return-spmf* 0

**by**(*simp add: geometric-spmf.simps*)

**context**

**fixes** *p* :: *real*

**and** *body* :: *bool*  $\times$  *nat*  $\Rightarrow$  (*bool*  $\times$  *nat*) *spmf*

**defines** [*simp*]: *body*  $\equiv$   $\lambda$ (*b*, *x*). *map-spmf* ( $\lambda$ *b'*. ( $\neg$  *b'*, *x* + (**if** *b'* **then** 0 **else** 1)))

(*bernoulli* *p*)

**begin**

**interpretation** *loop-spmf* *fst* *body*

**rewrites** *body*  $\equiv$   $\lambda$ (*b*, *x*). *map-spmf* ( $\lambda$ *b'*. ( $\neg$  *b'*, *x* + (**if** *b'* **then** 0 **else** 1)))

(*bernoulli* *p*)

**by**(*fact* *body-def*)

**lemma** *geometric-spmf-conv-while*:

```

shows geometric-spmf p = map-spmf snd (while (True, 0))
proof –
  have map-spmf ((+) x) (geometric-spmf p) = map-spmf snd (while (True, x))
(is ?lhs = ?rhs) for x
  proof(rule spmf.leq-antisym)
    show ord-spmf (=) ?lhs ?rhs
    proof(induction arbitrary: x rule: geometric-spmf-fixp-induct)
      case adm show ?case by simp
      case bottom show ?case by simp
      case (step geometric)
        show ?case using step.IH[of Suc x]
          apply(rewrite while.simps)
        apply(clarsimp simp add: map-spmf-bind-spmf bind-map-spmf intro!: ord-spmf-bind-refl)
          apply(rewrite while.simps)
          apply(clarsimp simp add: spmf.map-comp o-def)
        done
      qed
    have ord-spmf (=) ?rhs ?lhs
      and ord-spmf (=) (map-spmf snd (while (False, x))) (return-spmf x)
    proof(induction arbitrary: x and x rule: while-fixp-induct)
      case adm show ?case by simp
      case bottom case 1 show ?case by simp
      case bottom case 2 show ?case by simp
    next
      case (step while)
        case 1 show ?case using step.IH(1)[of Suc x] step.IH(2)[of x]
          by(rewrite geometric-spmf.simps)(clarsimp simp add: map-spmf-bind-spmf
bind-map-spmf spmf.map-comp o-def intro!: ord-spmf-bind-refl)
        case 2 show ?case by simp
      qed
    then show ord-spmf (=) ?rhs ?lhs by –
  qed
from this[of 0] show ?thesis by(simp cong: map-spmf-cong)
qed

```

```

lemma lossless-geometric [simp]: lossless-spmf (geometric-spmf p)  $\longleftrightarrow$  p > 0
proof(cases 0 < p  $\wedge$  p < 1)
  case True
    let ?body =  $\lambda(b, x :: \text{nat}). \text{map-spmf } (\lambda b'. (\neg b', x + (\text{if } b' \text{ then } 0 \text{ else } 1)))$ 
(bernoulli p)
    have lossless-spmf (while (True, 0))
    proof(rule termination-0-1-immediate)
      have {x. x} = {True} by auto
      then show p  $\leq$  spmf (map-spmf fst (?body s)) False for s :: bool  $\times$  nat using
True
      by(cases s)(simp add: spmf.map-comp o-def spmf-map vimage-def spmf-conv-measure-spmf[symmetric])
      show 0 < p using True by simp
    qed(clarsimp)
  with True show ?thesis by(simp add: geometric-spmf-conv-while)

```

**qed**(*auto simp add: spmf-geometric-nonpos spmf-geometric-ge-1*)

**end**

**lemma** *spmf-geometric*:

**assumes**  $p: 0 < p < 1$

**shows**  $\text{spmf } (\text{geometric-spmf } p) \ n = (1 - p) ^ n * p$  (**is**  $?lhs \ n = ?rhs \ n$ )

**proof**(*rule spmf-ub-tight*)

**fix**  $n$

**have**  $\text{ennreal } (?lhs \ n) \leq \text{ennreal } (?rhs \ n)$  **using**  $p$

**proof**(*induction arbitrary: n rule: geometric-spmf-fixp-induct*)

**case** *adm* **show**  $?case$  **by**(*rule cont-intro*)**+**

**case** *bottom* **show**  $?case$  **by** *simp*

**case** (*step geometric-spmf'*)

**then show**  $?case$

**by**(*cases n*)(*simp-all add: ennreal-spmf-bind nn-integral-measure-spmf UNIV-bool*

*nn-integral-count-space-finite ennreal-mult spmf-map vimage-def mult.assoc spmf-conv-measure-spmf[symmetric]*  
*mult-mono split: split-indicator*)

**qed**

**then show**  $?lhs \ n \leq ?rhs \ n$  **using**  $p$  **by**(*simp*)

**next**

**have**  $(\sum i. \text{ennreal } (p * (1 - p) ^ i)) = \text{ennreal } (p * (1 / (1 - (1 - p))))$  **using**

$p$

**by** (*intro suminf-ennreal-eq sums-mult geometric-sums*) *auto*

**then show**  $(\sum^+ x. \text{ennreal } ((1 - p) ^ x * p)) = \text{weight-spmf } (\text{geometric-spmf } p)$

**using** *lossless-geometric[of p] p unfolding lossless-spmf-def*

**by** (*simp add: nn-integral-count-space-nat field-simps*)

**qed**

**end**

### 4.3 Arbitrary uniform distributions

**theory** *Fast-Dice-Roll* **imports**

*Bernoulli*

*While-SPMF*

**begin**

This formalisation follows the ideas by Jérémie Lumbroso [2].

**lemma** *sample-bits-fusion*:

**fixes**  $v :: \text{nat}$

**assumes**  $0 < v$

**shows**

$\text{bind-pmf } (\text{pmf-of-set } \{..<v\}) \ (\lambda c. \text{bind-pmf } (\text{pmf-of-set } \text{UNIV}) \ (\lambda b. f \ (2 * c +$   
 $(\text{if } b \ \text{then } 1 \ \text{else } 0)))) =$

$\text{bind-pmf } (\text{pmf-of-set } \{..<2 * v\}) \ f$

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

**proof** –

```

have ?lhs = bind-pmf (map-pmf (λ(c, b). (2 * c + (if b then 1 else 0))) (pair-pmf
(pmf-of-set {..<v}) (pmf-of-set UNIV))) f
  (is - = bind-pmf (map-pmf ?f -) -)
  by(simp add: pair-pmf-def bind-map-pmf bind-assoc-pmf bind-return-pmf)
also have map-pmf ?f (pair-pmf (pmf-of-set {..<v}) (pmf-of-set UNIV)) =
pmf-of-set {..<2 * v}
  (is ?l = ?r is map-pmf ?f ?p = -)
proof(rule pmf-eqI)
  fix i :: nat
  have [simp]: inj ?f by(auto simp add: inj-on-def) arith+
  define i' where i' ≡ i div 2
  define b where b ≡ odd i
  have i: i = ?f (i', b) by(simp add: i'-def b-def)
  show pmf ?l i = pmf ?r i
  by(subst i; subst pmf-map-inj')(simp-all add: pmf-pair i'-def assms lessThan-empty-iff
split: split-indicator)
  qed
finally show ?thesis .
qed

```

**lemma** *sample-bits-fusion2*:

```

fixes v :: nat
assumes 0 < v
shows
  bind-pmf (pmf-of-set UNIV) (λb. bind-pmf (pmf-of-set {..<v}) (λc. f (c + v *
(if b then 1 else 0)))) =
  bind-pmf (pmf-of-set {..<2 * v}) f
  (is ?lhs = ?rhs)
proof -
  have ?lhs = bind-pmf (map-pmf (λ(c, b). (c + v * (if b then 1 else 0))) (pair-pmf
(pmf-of-set {..<v}) (pmf-of-set UNIV))) f
  (is - = bind-pmf (map-pmf ?f -) -)
  unfolding pair-pmf-def by(subst bind-commute-pmf)(simp add: bind-map-pmf
bind-assoc-pmf bind-return-pmf)
  also have map-pmf ?f (pair-pmf (pmf-of-set {..<v}) (pmf-of-set UNIV)) =
pmf-of-set {..<2 * v}
  (is ?l = ?r is map-pmf ?f ?p = -)
proof(rule pmf-eqI)
  fix i :: nat
  have [simp]: inj-on ?f ({..<v} × UNIV) by(auto simp add: inj-on-def)
  define i' where i' ≡ if i ≥ v then i - v else i
  define b where b ≡ i ≥ v
  have i: i = ?f (i', b) by(simp add: i'-def b-def)
  show pmf ?l i = pmf ?r i
  proof(cases i < 2 * v)
    case True
    thus ?thesis
  by(subst i; subst pmf-map-inj)(auto simp add: pmf-pair i'-def assms lessThan-empty-iff
split: split-indicator)

```

```

next
  case False
  hence  $i \notin \text{set-pmf } ?l \ i \notin \text{set-pmf } ?r$ 
    using assms by(auto simp add: lessThan-empty-iff split: if-split-asm)
    thus ?thesis by(simp add: set-pmf-iff del: set-map-pmf)
qed
qed
finally show ?thesis .
qed

```

**context** fixes  $n :: \text{nat}$  **notes**  $[[\text{function-internals}]]$  **begin**

The check for  $n \leq v$  should be done already at the start of the loop. Otherwise we do not see why this algorithm should be optimal (when we start with  $v = n$  and  $c = n - 1$ , then it can go round a few loops before it returns something).

We define the algorithm as a least fixpoint. To prove termination, we later show that it is equivalent to a while loop which samples bitstrings of a given length, which could in turn be implemented as a loop. The fixpoint formulation is more elegant because we do not need to nest any loops.

**partial-function** (*spmf*) *fast-dice-roll*  $:: \text{nat} \Rightarrow \text{nat} \Rightarrow \text{nat} \text{ spmf}$   
**where**

```

fast-dice-roll  $v \ c =$ 
  (if  $v \geq n$  then if  $c < n$  then return-spmf  $c$  else fast-dice-roll  $(v - n) \ (c - n)$ 
  else do {
     $b \leftarrow \text{coin-spmf}$ ;
    fast-dice-roll  $(2 * v) \ (2 * c + (\text{if } b \text{ then } 1 \text{ else } 0))$  } )

```

**lemma** *fast-dice-roll-fixp-induct* [*case-names adm bottom step*]:

```

assumes spmf.admissible  $(\lambda \text{fast-dice-roll}. P \ (\text{curry } \text{fast-dice-roll}))$ 
and  $P \ (\lambda v \ c. \ \text{return-pmf } \text{None})$ 
and  $\bigwedge \text{fdr}. P \ \text{fdr} \Longrightarrow P \ (\lambda v \ c. \ \text{if } v \geq n \text{ then if } c < n \text{ then return-spmf } c \text{ else fdr}$ 
 $(v - n) \ (c - n)$ 
  else bind-spmf coin-spmf  $(\lambda b. \ \text{fdr} \ (2 * v) \ (2 * c + (\text{if } b \text{ then } 1 \text{ else } 0)))$ )
shows  $P \ \text{fast-dice-roll}$ 
using assms by(rule fast-dice-roll.fixp-induct)

```

**definition** *fast-uniform*  $:: \text{nat} \text{ spmf}$

**where** *fast-uniform* = *fast-dice-roll* 1 0

**lemma** *spmf-fast-dice-roll-ub*:

```

assumes  $0 < v$ 
shows spmf  $(\text{bind-pmf} \ (\text{pmf-of-set } \{..<v\}) \ (\text{fast-dice-roll } v)) \ x \leq (\text{if } x < n \text{ then}$ 
 $1 / n \text{ else } 0)$ 
  (is ?lhs  $\leq$  ?rhs)
proof -
  have ennreal ?lhs  $\leq$  ennreal ?rhs using assms
  proof (induction arbitrary: v x rule: fast-dice-roll-fixp-induct)

```

```

case adm thus ?case
  by(rule cont-intro ccpo-class.admissible-leI)+ simp-all
case bottom thus ?case by simp
case (step fdr)
show ?case (is ?lhs ≤ ?rhs)
proof(cases n ≤ v)
  case le: True
    then have ?lhs = spmf (bind-pmf (pmf-of-set {..by simp
    also have ... = (∫+ c'. indicator (if x < n then {x} else {})) c' ∂measure-pmf
(pmf-of-set {..+ c'. indicator {n ..< v} c' * spmf (fdr (v - n) (c' - n)) x ∂measure-pmf
(pmf-of-set {..is ?then = ?found + ?continue) using step.premis
    by(subst nn-integral-add[symmetric])(auto simp add: ennreal-pmf-bind
AE-measure-pmf-iff lessThan-empty-iff split: split-indicator intro!: nn-integral-cong-AE)
    also have ?found = (if x < n then 1 else 0) / v using step.premis le
    by(auto simp add: measure-pmf.emmeasure-eq-measure measure-pmf-of-set
lessThan-empty-iff Iio-Int-singleton)
    also have ?continue = (∫+ c'. indicator {n ..< v} c' * 1 / v * spmf (fdr (v
- n) (c' - n)) x ∂count-space UNIV)
    using step.premis by(auto simp add: nn-integral-measure-pmf lessThan-empty-iff
ennreal-mult[symmetric] intro!: nn-integral-cong split: split-indicator)
    also have ... = (if v = n then 0 else ennreal ((v - n) / v) * spmf (bind-pmf
(pmf-of-set {n..using le step.premis
    by(subst ennreal-pmf-bind)(auto simp add: ennreal-mult[symmetric] nn-integral-measure-pmf
nn-integral-0-iff-AE AE-count-space nn-integral-cmult[symmetric] split: split-indicator)
    also {
      assume *: n < v
      then have pmf-of-set {n..by(subst map-pmf-of-set-inj)(auto 4 3 simp add: inj-on-def lessThan-empty-iff
intro!: arg-cong[where f=pmf-of-set] intro: rev-image-eqI[where x=- - n] diff-less-mono)
      also have bind-pmf ... (λc'. fdr (v - n) (c' - n)) = bind-pmf (pmf-of-set
{..by(simp add: bind-map-pmf)
      also have ennreal (spmf ... x) ≤ (if x < n then 1 / n else 0)
      by(rule step.IH)(simp add: *)
      also note calculation }
    then have ... ≤ ennreal ((v - n) / v) * (if x < n then 1 / n else 0) using
le
    by(cases v = n)(auto split del: if-split intro: divide-right-mono mult-left-mono)
    also have ... = (v - n) / v * (if x < n then 1 / n else 0) by(simp add:
ennreal-mult[symmetric])
    finally show ?thesis using le by(auto simp add: add-mono field-simps
of-nat-diff ennreal-plus[symmetric] simp del: ennreal-plus)
  next
    case False

```



```

then have ?lhs = spmf (bind-pmf (pmf-of-set {.. $v$ }) ( $\lambda c$ . bind-pmf (pmf-of-set
UNIV) ( $\lambda b$ . fdr ( $2 * v$ ) ( $2 * c + (if\ b\ then\ 1\ else\ 0)$ ))))  $x$ 
  by(simp add: bind-spmf-spmf-of-set)
also have ... = spmf (bind-pmf (pmf-of-set {.. $2 * v$ }) (fdr ( $2 * v$ )))  $x$ 
using step.premis
  by(simp add: sample-bits-fusion[symmetric])
also have ...  $\leq$  ?rhs using step.premis by(intro step.IH) simp
finally show ?thesis .
qed
qed
thus ?thesis by simp
qed

```

```

lemma spmf-fast-uniform-ub:
  spmf fast-uniform  $x \leq (if\ x < n\ then\ 1 / n\ else\ 0)$ 
proof -
  have {.. $Suc\ 0$ } = {0} by auto
  then show ?thesis using spmf-fast-dice-roll-ub[of 1  $x$ ]
  by(simp add: fast-uniform-def pmf-of-set-singleton bind-return-pmf split: if-split-asm)
qed

```

```

lemma fast-dice-roll-0 [simp]: fast-dice-roll 0  $c = return$ -pmf None
by(induction arbitrary:  $c$  rule: fast-dice-roll-fix-induct)(simp-all add: bind-eq-return-pmf-None)

```

To prove termination, we fold all the iterations that only double into one big step

```

definition fdr-step :: nat  $\Rightarrow$  nat  $\Rightarrow$  (nat  $\times$  nat) spmf
where
  fdr-step  $v\ c =$ 
  (if  $v = 0$  then return-pmf None
  else let  $x = 2^{\wedge}(nat\ \lceil\log\ 2\ (max\ 1\ n) - \log\ 2\ v\rceil)$  in
  map-spmf ( $\lambda bs$ . ( $x * v$ ,  $x * c + bs$ )) (spmof-of-set {.. $x$ }))

```

```

lemma fdr-step-unfold:
  fdr-step  $v\ c =$ 
  (if  $v = 0$  then return-pmf None
  else if  $n \leq v$  then return-spmf ( $v$ ,  $c$ )
  else do {
     $b \leftarrow coin$ -spmof;
    fdr-step ( $2 * v$ ) ( $2 * c + (if\ b\ then\ 1\ else\ 0)$ ) })
  (is ?lhs = ?rhs is - = (if - then - else ?else))
proof(cases  $v = 0$ )
case  $v$ : False
define  $x$  where  $x \equiv \lambda v :: nat$ .  $2^{\wedge}(nat\ \lceil\log\ 2\ (max\ 1\ n) - \log\ 2\ v\rceil) :: nat$ 
have  $x$ -pos:  $x > 0$  by(simp add:  $x$ -def)

show ?thesis
proof(cases  $n \leq v$ )
case  $le$ : True

```

```

hence  $x v = 1$  using  $v$  by(simp add: x-def log-le)
moreover have  $\{..<1\} = \{0 :: nat\}$  by auto
ultimately show ?thesis using le v by(simp add: fdr-step-def spmf-of-set-singleton)
next
case less: False
hence even: even (x v) using  $v$  by(simp add: x-def)
with x-pos have x-ge-1: x v > 1 by(cases x v = 1) auto
have  $*$ :  $x (2 * v) = x v \text{ div } 2$  using  $v$  less unfolding x-def
  apply(simp add: log-mult diff-add-eq-diff-diff-swap)
  apply(rewrite in - = 2 ^  $\sqsupset$  div - le-add-diff-inverse2[symmetric, where b=1])
  apply(simp add: Suc-leI)
  apply(simp del: Suc-pred)
done

have ?lhs = map-spmf ( $\lambda bs. (x v * v, x v * c + bs)$ ) (spmf-of-set  $\{..<x v\}$ )
  using  $v$  by(simp add: fdr-step-def x-def Let-def)
also from even have  $\dots = \text{bind-pmf}$  (pmf-of-set  $\{..<2 * (x v \text{ div } 2)\}$ ) ( $\lambda bs.$ 
return-spmf ( $x v * v, x v * c + bs$ ))
  by(simp add: map-spmf-conv-bind-spmf bind-spmf-spmf-of-set x-pos lessThan-empty-iff)
  also have  $\dots = \text{bind-spmf}$  coin-spmf ( $\lambda b. \text{bind-spmf}$  (spmf-of-set  $\{..<x v \text{ div } 2\}$ )
    ( $\lambda c'. \text{return-spmf}$  ( $x v * v, x v * c + c' + (x v \text{ div } 2) * (\text{if } b \text{ then } 1 \text{ else } 0)$ ))))
    using x-ge-1
  by(simp add: sample-bits-fusion2[symmetric] bind-spmf-spmf-of-set lessThan-empty-iff
add.assoc)
  also have  $\dots = \text{bind-spmf}$  coin-spmf ( $\lambda b. \text{map-spmf}$  ( $\lambda bs. (x (2 * v) * (2 * v),$ 
 $x (2 * v) * (2 * c + (\text{if } b \text{ then } 1 \text{ else } 0)) + bs)$ ) (spmf-of-set  $\{..<x (2 * v)\}$ )))
    using  $*$  even by(simp add: map-spmf-conv-bind-spmf algebra-simps)
  also have  $\dots = ?rhs$  using  $v$  less by(simp add: fdr-step-def Let-def x-def)
  finally show ?thesis .
qed
qed(simp add: fdr-step-def)

lemma fdr-step-induct [case-names fdr-step]:
  ( $\bigwedge v c. (\bigwedge b. \llbracket v \neq 0; v < n \rrbracket \implies P (2 * v) (2 * c + (\text{if } b \text{ then } 1 \text{ else } 0)) \implies P$ 
 $v c)$ 
 $\implies P v c$ 
  apply induction-schema
  apply pat-completeness
  apply(relation Wellfounded.measure ( $\lambda(v, c). n - v$ ))
  apply simp-all
done

partial-function (spm) fdr-alt ::  $nat \Rightarrow nat \Rightarrow nat$  spm
where
  fdr-alt  $v c = \text{do}$  {
    ( $v', c'$ )  $\leftarrow$  fdr-step  $v c$ ;
    if  $c' < n$  then return-spmf  $c'$  else fdr-alt ( $v' - n$ ) ( $c' - n$ ) }

```

```

lemma fast-dice-roll-alt: fdr-alt = fast-dice-roll
proof(intro ext)
  show fdr-alt v c = fast-dice-roll v c for v c
  proof(rule spmf.leq-antisym)
    show ord-spmf (=) (fdr-alt v c) (fast-dice-roll v c)
    proof(induction arbitrary: v c rule: fdr-alt.fixp-induct[case-names adm bottom
step])
      case adm show ?case by simp
      case bottom show ?case by simp
      case (step fdra)
      show ?case
      proof(induction v c rule: fdr-step-induct)
        case inner: (fdr-step v c)
        show ?case
          apply(rewrite fdr-step-unfold)
          apply(rewrite fast-dice-roll.simps)
          apply(auto intro!: ord-spmf-bind-reflI simp add: Let-def inner.IH step.IH)
          done
        qed
      qed
      have ord-spmf (=) (fast-dice-roll v c) (fdr-alt v c)
      and fast-dice-roll 0 c = return-pmf None
      proof(induction arbitrary: v c rule: fast-dice-roll-fixp-induct)
        case adm thus ?case by simp
        case bottom case 1 thus ?case by simp
        case bottom case 2 thus ?case by simp
        case (step fdr) case 1 show ?case
          apply(rewrite fdr-alt.simps)
          apply(rewrite fdr-step-unfold)
          apply(clarsimp simp add: Let-def)
          apply(auto intro!: ord-spmf-bind-reflI simp add: fdr-alt.simps[symmetric]
step.IH rel-pmf-return-pmf2 set-pmf-bind-spmf o-def set-pmf-spmf-of-set split: if-split-asm)
          done
        case step case 2 from step.IH show ?case by(simp add: Let-def bind-eq-return-pmf-None)
        qed
      then show ord-spmf (=) (fast-dice-roll v c) (fdr-alt v c) by –
      qed
    qed
  qed

```

**lemma** lossless-fdr-step [simp]: lossless-spmf (fdr-step v c)  $\longleftrightarrow$  v > 0  
**by**(simp add: fdr-step-def Let-def lessThan-empty-iff)

**lemma** fast-dice-roll-alt-conv-while:

```

  fdr-alt v c =
    map-spmf snd (bind-spmf (fdr-step v c) (loop-spmf.while ( $\lambda(v, c). n \leq c$ ) ( $\lambda(v, c). fdr-step (v - n) (c - n)$ )))
proof(induction arbitrary: v c rule: parallel-fixp-induct-2-1[OF partial-function-definitions-spmf
partial-function-definitions-spmf fdr-alt.mono loop-spmf.while.mono fdr-alt-def loop-spmf.while-def,
case-names adm bottom step])

```

```

case adm show ?case by(simp)
case bottom show ?case by simp
case (step fdr while)
show ?case using step.IH
  by(auto simp add: map-spmf-bind-spmf o-def intro!: bind-spmf-cong[OF refl])
qed

lemma lossless-fast-dice-roll:
  assumes  $c < v$   $v \leq n$ 
  shows lossless-spmf (fast-dice-roll v c)
proof(cases  $v < n$ )
  case True
    let ?I =  $\lambda(v, c). c < v \wedge n \leq v \wedge v < 2 * n$ 
    let ?f =  $\lambda(v, c). \text{if } n \leq c \text{ then } n + c - v + 1 \text{ else } 0$ 
    have invar: ?I (v', c') if step: (v', c')  $\in$  set-spmf (fdr-step (v - n) (c - n))
      and I:  $c < v$   $n \leq v$   $v < 2 * n$  and c:  $n \leq c$  for v' c' v c
    proof(clarsimp; safe)
      define x where  $x = \text{nat } \lceil \log 2 (\max 1 n) - \log 2 (v - n) \rceil$ 
      have **:  $-1 < \log 2 (\text{real } n / \text{real } (v - n))$  by(rule less-le-trans[where
y=0])(use I c in ‹auto›)

      from I c step obtain bs where v':  $v' = 2^x * (v - n)$ 
        and c':  $c' = 2^x * (c - n) + bs$ 
        and bs:  $bs < 2^x$ 
      unfolding fdr-step-def x-def[symmetric] by(auto simp add: Let-def)
      have  $2^x * (c - n) + bs < 2^x * (c - n + 1)$  unfolding distrib-left using
bs
      by(intro add-strict-left-mono) simp
      also have  $\dots \leq 2^x * (v - n)$  using I c by(intro mult-left-mono) auto
      finally show  $c' < v'$  using c' v' by simp

      have  $v' = 2^{\text{powr } x} * (v - n)$  by(simp add: powr-realpow v')
      also have  $\dots < 2^{\text{powr } (\log 2 (\max 1 n) - \log 2 (v - n) + 1)} * (v - n)$ 
        using ** I c by(intro mult-strict-right-mono)(auto simp add: x-def log-divide)
      also have  $\dots \leq 2 * n$  unfolding powr-add using I c
        by(simp add: log-divide[symmetric] max-def)
      finally show  $v' < 2 * n$  using c' by(simp del: of-nat-add)

      have  $\log 2 (n / (v - n)) \leq x$  using I c ** by(auto simp add: x-def log-divide
max-def)
      hence  $2^{\text{powr } \log 2 (n / (v - n))} \leq 2^{\text{powr } x}$  by(rule powr-mono) simp
      also have  $2^{\text{powr } \log 2 (n / (v - n))} = n / (v - n)$  using I c by(simp)
      finally have  $n \leq \text{real } (2^x * (v - n))$  using I c by(simp add: field-simps
powr-realpow)
      then show  $n \leq v'$  by(simp add: v' del: of-nat-mult)
qed

have loop: lossless-spmf (loop-spmf.while ( $\lambda(v, c). n \leq c$ ) ( $\lambda(v, c). \text{fdr-step } (v - n) (c - n)$ ) (v, c))

```

```

if  $c < 2 * n$  and  $n \leq v$  and  $c < v$  and  $v < 2 * n$ 
for  $v$   $c$ 
proof(rule termination-variant-invar; clarify?)
  fix  $v$   $c$ 
  assume  $I: ?I (v, c)$  and  $c: n \leq c$ 
  show  $?f (v, c) \leq n$  using  $I$   $c$  by auto

  define  $x$  where  $x = \text{nat } [\log 2 (\max 1 n) - \log 2 (v - n)]$ 
  define  $p :: \text{real}$  where  $p \equiv 1 / (2 * n)$ 

  from  $I$   $c$  have  $n: 0 < n$  and  $v: n < v$  by auto
  from  $I$   $c$   $v$   $n$  have  $x\text{-pos}: x > 0$  by(auto simp add: x-def max-def)

  have  $**:$   $-1 < \log 2 (\text{real } n / \text{real } (v - n))$  by(rule less-le-trans[where y=0](use I c in ‹auto›))
  then have  $x \leq \log 2 (\text{real } n) + 1$  using  $v$   $n$ 
    by(auto simp add: x-def log-divide[symmetric] max-def field-simps intro: order-trans[OF of-int-ceiling-le-add-one])
  hence  $2^{\text{powr } x} \leq 2^{\text{powr } \dots}$  by(rule powr-mono) simp
  hence  $p \leq 1 / 2^x$  unfolding powr-add using  $n$ 
    by(subst (asm) powr-realpow, simp)(subst (asm) powr-log-cancel; simp-all add: p-def field-simps))
  also
    let  $?X = \{c'. n \leq 2^x * (c - n) + c' \longrightarrow n + (2^x * (c - n) + c') - 2^x * (v - n) < n + c - v\}$ 
    have  $n + c * 2^x - v * 2^x < c + n - v$  using  $I$   $c$ 
    proof(cases n + c * 2^x \geq v * 2^x)
      case True
        have  $(\text{int } c - v) * 2^x < (\text{int } c - v) * 1$ 
          using  $x\text{-pos}$   $I$   $c$  by(intro mult-strict-left-mono-neg simp-all)
        then have  $\text{int } n + c * 2^x - v * 2^x < c + \text{int } n - v$  by(simp add: algebra-simps)
        also have  $\dots = \text{int } (c + n - v)$  using  $I$   $c$  by auto
        also have  $\text{int } n + c * 2^x - v * 2^x = \text{int } (n + c * 2^x - v * 2^x)$ 
          using True that by(simp add: of-nat-diff)
        finally show  $?thesis$  by simp
      qed auto
    then have  $\{.. < 2^x\} \cap ?X \neq \{\}$  using  $n$   $v$ 
    by(auto simp add: disjoint-eq-subset-Compl Collect-neg-eq[symmetric] lessThan-subset-Collect algebra-simps intro: exI[where x=0])
    then have  $0 < \text{card } (\{.. < 2^x\} \cap ?X)$  by(simp add: card-gt-0-iff)
    hence  $1 / 2^x \leq \dots / 2^x$  by(simp add: field-simps)
    finally show  $p \leq \text{spmf } (\text{map-spmf } (\lambda s'. ?f s' < ?f (v, c))) (\text{fdr-step } (v - n) (c - n))$  True
      using  $I$   $c$  unfolding fdr-step-def x-def[symmetric]
      by(clarsimp simp add: Let-def spmf.map-comp o-def spmf-map measure-spmf-of-set vimage-def p-def)

  show lossless-spmf (fdr-step  $(v - n)$   $(c - n)$ ) using  $I$   $c$  by simp

```

```

  show ?I (v', c') if step: (v', c') ∈ set-spmf (fdr-step (v - n) (c - n)) for v'
c'
  using that by(rule invar)(use I c in auto)
next
  show (0 :: real) < 1 / (2 * n) using that by(simp)
  show ?I (v, c) using that by simp
qed
show ?thesis using assms True
  by(auto simp add: fast-dice-roll-alt[symmetric] fast-dice-roll-alt-conv-while in-
tro!: loop dest: invar[of - - n + v n + c, simplified])
next
  case False
  with assms have v = n by simp
  thus ?thesis using assms by(subst fast-dice-roll.simps) simp
qed

```

```

lemma fast-dice-roll-n0:
  assumes n = 0
  shows fast-dice-roll v c = return-pmf None
  by(induction arbitrary: v c rule: fast-dice-roll-fixp-induct)(simp-all add: assms)

```

```

lemma lossless-fast-uniform [simp]: lossless-spmf fast-uniform ↔ n > 0
proof(cases n = 0)
  case True
  then show ?thesis using fast-dice-roll-n0 unfolding fast-uniform-def by(simp)
next
  case False
  then show ?thesis by(simp add: fast-uniform-def lossless-fast-dice-roll)
qed

```

```

lemma spmf-fast-uniform: spmf fast-uniform x = (if x < n then 1 / n else 0)
proof(cases n > 0)
  case n: True
  show ?thesis using spmf-fast-uniform-ub
  proof(rule spmf-ub-tight)
    have (∑+ x. ennreal (if x < n then 1 / n else 0)) = (∑+ x ∈ {.. $n$ }. 1 / n)
    by(auto simp add: nn-integral-count-space-indicator simp del: nn-integral-const
intro: nn-integral-cong)
    also have ... = 1 using n by(simp add: field-simps ennreal-of-nat-eq-real-of-nat
ennreal-mult[symmetric])
    also have ... = weight-spmf fast-uniform using lossless-fast-uniform n un-
folding lossless-spmf-def by simp
    finally show (∑+ x. ennreal (if x < n then 1 / n else 0)) = ... .
  qed
next
  case False
  with fast-dice-roll-n0[of 1 0] show ?thesis unfolding fast-uniform-def by(simp)
qed

```

**end**

**lemma** *fast-uniform-conv-uniform*: *fast-uniform*  $n = \text{spmf-of-set } \{..<n\}$   
**by**(*rule* *spmf-eqI*)(*simp* *add*: *spmf-fast-uniform* *spmf-of-set*)

**end**

**theory** *Resampling imports*

*While-SPMF*

**begin**

**lemma** *ord-spmf-lossless*:

**assumes** *ord-spmf* (=)  $p\ q$  *lossless-spmf*  $p$

**shows**  $p = q$

**unfolding** *pmf.rel-eq*[*symmetric*] **using** *assms*(1)

**by**(*rule* *pmf.rel-mono-strong*)(*use* *assms*(2) **in**  $\langle \text{auto elim!}: \text{ord-option.cases simp add: lossless-iff-set-pmf-None} \rangle$ )

**context** *notes* [[*function-internals*]] **begin**

**partial-function** (*spmf*) *resample* :: ' $a$  set  $\Rightarrow$  ' $a$  set  $\Rightarrow$  ' $a$  *spmf* **where**

*resample*  $A\ B = \text{bind-spmf } (\text{spmf-of-set } A) (\lambda x. \text{if } x \in B \text{ then return-spmf } x \text{ else } \text{resample } A\ B)$

**end**

**lemmas** *resample-fixp-induct*[*case-names adm bottom step*] = *resample.fixp-induct*

**context**

**fixes**  $A :: 'a$  set

**and**  $B :: 'a$  set

**begin**

**interpretation** *loop-spmf*  $\lambda x. x \notin B \lambda-. \text{spmf-of-set } A$  .

**lemma** *resample-conv-while*: *resample*  $A\ B = \text{bind-spmf } (\text{spmf-of-set } A) \text{ while}$

**proof**(*induction* *rule*: *parallel-fixp-induct-2-1*[*OF* *partial-function-definitions-spmf* *partial-function-definitions-spmf* *resample.mono* *while.mono* *resample-def* *while-def*, *case-names adm bottom step*])

**case** *adm* **show** ?*case* **by** *simp*

**case** *bottom* **show** ?*case* **by** *simp*

**case** (*step* *resample'* *while'*) **then** **show** ?*case* **by**(*simp* *add*: *z3-rule*(33) *cong* *del*: *if-cong*)

**qed**

**context**

**assumes**  $A$ : *finite*  $A$

**and**  $B$ :  $B \subseteq A\ B \neq \{\}$

```

begin

private lemma A-nonempty: A ≠ {}
  using B by blast

private lemma B-finite: finite B
  using A B by (blast intro: finite-subset)

lemma lossless-resample: lossless-spmf (resample A B)
proof -
  from B have [simp]: A ∩ B ≠ {} by auto
  have lossless-spmf (while x) for x
    by (rule termination-0-1-immediate [where p = card (A ∩ B) / card A])
    (simp-all add: spmf-map vimage-def measure-spmf-of-set field-simps A-nonempty
A not-le card-gt-0-iff B)
  then show ?thesis by (clarsimp simp add: resample-conv-while A A-nonempty)
qed

lemma resample-le-sample:
  ord-spmf (=) (resample A B) (spmf-of-set B)
proof (induction rule: resample-fixp-induct)
  case adm show ?case by simp
  case bottom show ?case by simp
  case (step resample')
  note [simp] = B-finite A
  show ?case
  proof (rule ord-pmf-increaseI)
    fix x
    let ?f = λx. if x ∈ B then return-spmf x else resample' A B
    have spmf (bind-spmf (spmf-of-set A) ?f) x =
      (∑ n ∈ B ∪ (A - B). if n ∈ B then (if n = x then 1 else 0) / card A else spmf
(resample' A B) x / card A)
    using B
    by (auto simp add: spmf-bind integral-spmf-of-set sum-divide-distrib if-distrib [where
f = λp. spmf p - / -] cong: if-cong intro!: sum.cong split: split-indicator-asm)
    also have ... = (∑ n ∈ B. (if n = x then 1 else 0) / card A) + (∑ n ∈ A - B.
spmf (resample' A B) x / card A)
    by (subst sum.union-disjoint) (auto)
    also have ... = (if x ∈ B then 1 / card A else 0) + card (A - B) / card A *
spmf (resample' A B) x
    by (simp cong: sum.cong add: if-distrib [where f = λx. x / -] cong: if-cong)
    also have ... ≤ (if x ∈ B then 1 / card A else 0) + card (A - B) / card A *
spmf (spmf-of-set B) x
    by (intro add-left-mono mult-left-mono step.IH [THEN ord-spmf-eq-leD]) simp
    also have ... = spmf (spmf-of-set B) x using B
    by (simp add: spmf-of-set field-simps A-nonempty card-Diff-subset card-mono
of-nat-diff)
  finally show spmf (bind-spmf (spmf-of-set A) ?f) x ≤ ... .
  qed simp

```



qed

**lemma** *resample-eq-sample*: *resample A B = spmf-of-set B*  
**using** *resample-le-sample lossless-resample* **by**(*rule ord-spmf-lossless*)

end

end

end

## References

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