

Lovasz Local Lemma

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Abstract

This entry aims to formalise several useful general techniques for using the *probabilistic method* for combinatorial structures (or discrete spaces more generally). In particular, it focuses on bounding tools, such as the union and complete independence bounds, and the first formalisation of the pivotal Lovász local lemma. The formalisation focuses on the general lemma, however also proves several useful variations, including the more well known symmetric version. Both the original formalisation and several of the variations used dependency graphs, which were formalised using Noschinski's general directed graph library [2]. Additionally, the entry provides several useful existence lemmas, required at the end of most probabilistic proofs on combinatorial structures. Finally, the entry includes several significant extensions to the existing probability libraries, particularly for conditional probability (such as Bayes theorem) and independent events. The formalisation is primarily based on Alon and Spencer's textbook [1], as well as Zhao's course notes [3].

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1 Extensional function extras

Counting lemmas (i.e. reasoning on cardinality) of sets on the extensional function relation

```
theory PiE-Rel-Extras imports Card-Partitions.Card-Partitions
begin
```

1.1 Relations and Extensional Function sets

A number of lemmas to convert between relations and functions for counting purposes. Note, ultimately not needed in this formalisation, but may be of use in the future

```
lemma Range-unfold: Range r = {y. ∃ x. (x, y) ∈ r}
  ⟨proof⟩
```

```
definition fun-to-rel: 'a set ⇒ 'b set ⇒ ('a ⇒ 'b) ⇒ ('a × 'b) set where
  fun-to-rel A B f ≡ {(a, b) | a ∈ A ∧ b ∈ B ∧ f a = b}
```

```
definition rel-to-fun: ('a × 'b) set ⇒ ('a ⇒ 'b) where
  rel-to-fun R ≡ λ a . (if a ∈ Domain R then (THE b . (a, b) ∈ R) else undefined)
```

```
lemma fun-to-relI: a ∈ A ⇒ b ∈ B ⇒ f a = b ⇒ (a, b) ∈ fun-to-rel A B f
  ⟨proof⟩
```

```
lemma fun-to-rel-alt: fun-to-rel A B f ≡ {(a, f a) | a ∈ A ∧ f a ∈ B}
```

```
lemma fun-to-relI2: a ∈ A ⇒ f a ∈ B ⇒ (a, f a) ∈ fun-to-rel A B f
  ⟨proof⟩
```

lemma *rel-to-fun-in*[simp]: $a \in \text{Domain } R \implies (\text{rel-to-fun } R) a = (\text{THE } b . (a, b) \in R)$
 $\langle \text{proof} \rangle$

lemma *rel-to-fun-undefined*[simp]: $a \notin \text{Domain } R \implies (\text{rel-to-fun } R) a = \text{undefined}$
 $\langle \text{proof} \rangle$

lemma *single-valued-unique-Dom-iff*: $\text{single-valued } R \longleftrightarrow (\forall x \in \text{Domain } R. \exists! y . (x, y) \in R)$
 $\langle \text{proof} \rangle$

lemma *rel-to-fun-range*:
assumes *single-valued R*
assumes $a \in \text{Domain } R$
shows $(\text{THE } b . (a, b) \in R) \in \text{Range } R$
 $\langle \text{proof} \rangle$

lemma *rel-to-fun-extensional*: $\text{single-valued } R \implies \text{rel-to-fun } R \in (\text{Domain } R \rightarrow_E \text{Range } R)$
 $\langle \text{proof} \rangle$

lemma *single-value-fun-to-rel*: $\text{single-valued } (\text{fun-to-rel } A B f)$
 $\langle \text{proof} \rangle$

lemma *fun-to-rel-domain*:
assumes $f \in A \rightarrow_E B$
shows $\text{Domain } (\text{fun-to-rel } A B f) = A$
 $\langle \text{proof} \rangle$

lemma *fun-to-rel-range*:
assumes $f \in A \rightarrow_E B$
shows $\text{Range } (\text{fun-to-rel } A B f) \subseteq B$
 $\langle \text{proof} \rangle$

lemma *rel-to-fun-to-rel*:
assumes $f \in A \rightarrow_E B$
shows $\text{rel-to-fun } (\text{fun-to-rel } A B f) = f$
 $\langle \text{proof} \rangle$

lemma *fun-to-rel-to-fun*:
assumes *single-valued R*
shows $\text{fun-to-rel } (\text{Domain } R) (\text{Range } R) (\text{rel-to-fun } R) = R$
 $\langle \text{proof} \rangle$

lemma *bij-betw-fun-to-rel*:
assumes $f \in A \rightarrow_E B$
shows $\text{bij-betw } (\lambda a . (a, f a)) A (\text{fun-to-rel } A B f)$
 $\langle \text{proof} \rangle$

```

lemma fun-to-rel-indiv-card:
  assumes  $f \in A \rightarrow_E B$ 
  shows  $\text{card}(\text{fun-to-rel } A B f) = \text{card } A$ 
  ⟨proof⟩

lemma fun-to-rel-inj:
  assumes  $C \subseteq A \rightarrow_E B$ 
  shows inj-on (fun-to-rel A B) C
  ⟨proof⟩

lemma fun-to-rel-ss: fun-to-rel A B f  $\subseteq A \times B$ 
  ⟨proof⟩

lemma card-fun-to-rel:  $C \subseteq A \rightarrow_E B \implies \text{card } C = \text{card}((\lambda f . \text{fun-to-rel } A B f) ` C)$ 
  ⟨proof⟩

```

1.2 Cardinality Lemmas

Lemmas to count variations of filtered sets over the extensional function set relation

```

lemma card-PiE-filter-range-set:
  assumes  $\bigwedge a. a \in A' \implies X a \in C$ 
  assumes  $A' \subseteq A$ 
  assumes finite A
  shows  $\text{card}\{f \in A \rightarrow_E C . \forall a \in A'. f a = X a\} = (\text{card } C) \hat{\wedge} (\text{card } A - \text{card } A')$ 
  ⟨proof⟩

lemma card-PiE-filter-range-indiv:  $X a' \in C \implies a' \in A \implies \text{finite } A \implies$ 
   $\text{card}\{f \in A \rightarrow_E C . f a' = X a'\} = (\text{card } C) \hat{\wedge} (\text{card } A - 1)$ 
  ⟨proof⟩

lemma card-PiE-filter-range-set-const:  $c \in C \implies A' \subseteq A \implies \text{finite } A \implies$ 
   $\text{card}\{f \in A \rightarrow_E C . \forall a \in A'. f a = c\} = (\text{card } C) \hat{\wedge} (\text{card } A - \text{card } A')$ 
  ⟨proof⟩

lemma card-PiE-filter-range-set-nat:  $c \in \{0..<n\} \implies A' \subseteq A \implies \text{finite } A \implies$ 
   $\text{card}\{f \in A \rightarrow_E \{0..<n\} . \forall a \in A'. f a = c\} = n \hat{\wedge} (\text{card } A - \text{card } A')$ 
  ⟨proof⟩

```

end

2 Digraph extensions

Extensions to the existing library for directed graphs, basically neighborhood

```

theory Digraph-Extensions
  imports

```

```

Graph-Theory.Digraph
Graph-Theory.Pair-Digraph
begin

definition (in pre-digraph) neighborhood :: 'a ⇒ 'a set where
  neighborhood u ≡ {v ∈ verts G . dominates G u v}

lemma (in wf-digraph) neighborhood-wf: neighborhood v ⊆ verts G
  ⟨proof⟩

lemma (in pair-pre-digraph) neighborhood-alt:
  neighborhood u = {v ∈ pverts G . (u, v) ∈ parcs G}
  ⟨proof⟩

lemma (in fin-digraph) neighborhood-finite: finite (neighborhood v)
  ⟨proof⟩

lemma (in wf-digraph) neighborhood-edge-iff: y ∈ neighborhood x ↔ (x, y) ∈
  arcs-ends G
  ⟨proof⟩

lemma (in loopfree-digraph) neighborhood-self-not: v ∉ (neighborhood v)
  ⟨proof⟩

lemma (in nomulti-digraph) inj-on-head-out-arcs: inj-on (head G) (out-arcs G u)
  ⟨proof⟩

lemma (in nomulti-digraph) out-degree-neighborhood: out-degree G u = card (neighborhood
  u)
  ⟨proof⟩

lemma (in digraph) neighborhood-empty-iff: out-degree G u = 0 ↔ neighborhood
  u = {}
  ⟨proof⟩

end

```

3 General Event Lemmas

General lemmas for reasoning on events in probability spaces after different operations

```

theory Prob-Events-Extras
imports
  HOL-Probability.Probability
  PiE-Rel-Extras
begin

context prob-space

```

```

begin

lemma prob-sum-Union:
  assumes measurable: finite A A ⊆ events disjoint A
  shows prob (⋃ A) = (∑ e∈A. prob (e))
  ⟨proof⟩

lemma events-inter:
  assumes finite S
  assumes S ≠ {}
  shows (∏ A. A ∈ S ⇒ A ∈ events) ⇒ ∏ S ∈ events
  ⟨proof⟩

lemma events-union:
  assumes finite S
  shows (∏ A. A ∈ S ⇒ A ∈ events) ⇒ ∪ S ∈ events
  ⟨proof⟩

lemma prob-inter-set-lt-elem: A ∈ events ⇒ prob (A ∩ (∏ AS)) ≤ prob A
  ⟨proof⟩

lemma Inter-event-ss: finite A ⇒ A ⊆ events ⇒ A ≠ {} ⇒ ∏ A ∈ events
  ⟨proof⟩

lemma prob-inter-ss-lt:
  assumes finite A
  assumes A ⊆ events
  assumes B ≠ {}
  assumes B ⊆ A
  shows prob (∏ A) ≤ prob (∏ B)
  ⟨proof⟩

lemma prob-inter-ss-lt-index:
  assumes finite A
  assumes F ` A ⊆ events
  assumes B ≠ {}
  assumes B ⊆ A
  shows prob (∏ (F ` A)) ≤ prob (∏ (F ` B))
  ⟨proof⟩

lemma space-compl-double:
  assumes S ⊆ events
  shows ((-) (space M)) ` (((-) (space M)) ` S) = S
  ⟨proof⟩

lemma bij-betw-compl-sets:
  assumes S ⊆ events
  assumes S' = ((-) (space M)) ` S
  shows bij-betw ((-) (space M)) S' S

```

$\langle proof \rangle$

lemma bij-betw-compl-sets-rev:
 assumes $S \subseteq events$
 assumes $S' = ((-) (space M)) ` S$
 shows bij-betw $((-) (space M)) S S'$
 $\langle proof \rangle$

lemma prob0-basic-inter: $A \in events \Rightarrow B \in events \Rightarrow prob A = 0 \Rightarrow prob (A \cap B) = 0$
 $\langle proof \rangle$

lemma prob0-basic-Inter: $A \in events \Rightarrow B \subseteq events \Rightarrow prob A = 0 \Rightarrow prob (A \cap (\bigcap B)) = 0$
 $\langle proof \rangle$

lemma prob1-basic-inter: $A \in events \Rightarrow B \in events \Rightarrow prob A = 1 \Rightarrow prob (A \cap B) = prob B$
 $\langle proof \rangle$

lemma prob1-basic-Inter:
 assumes $A \in events B \subseteq events$
 assumes $prob A = 1$
 assumes $B \neq \{\}$
 assumes finite B
 shows $prob (A \cap (\bigcap B)) = prob (\bigcap B)$
 $\langle proof \rangle$

lemma compl-identity: $A \in events \Rightarrow space M - (space M - A) = A$
 $\langle proof \rangle$

lemma prob-addition-rule: $A \in events \Rightarrow B \in events \Rightarrow prob (A \cup B) = prob A + prob B - prob (A \cap B)$
 $\langle proof \rangle$

lemma compl-subset-in-events: $S \subseteq events \Rightarrow ((-) (space M)) ` S \subseteq events$
 $\langle proof \rangle$

lemma prob-compl-diff-inter: $A \in events \Rightarrow B \in events \Rightarrow prob (A \cap (space M - B)) = prob A - prob (A \cap B)$
 $\langle proof \rangle$

lemma bij-betw-prod-prob: bij-betw $f A B \Rightarrow (\prod b \in B. prob b) = (\prod a \in A. prob (f a))$
 $\langle proof \rangle$

definition event-compl :: 'a set \Rightarrow 'a set **where**
 $event-compl A \equiv space M - A$

lemma *compl-Union*: $A \neq \{\} \implies \text{space } M - (\bigcup A) = (\bigcap a \in A . (\text{space } M - a))$
 $\langle \text{proof} \rangle$

lemma *compl-Union-fn*: $A \neq \{\} \implies \text{space } M - (\bigcup (F ` A)) = (\bigcap a \in A . (\text{space } M - F a))$
 $\langle \text{proof} \rangle$

end

Reasoning on the probability of function sets

lemma *card-PiE-val-ss-eq*:
assumes *finite A*
assumes *b ∈ B*
assumes *d ⊆ A*
assumes *B ≠ {}*
assumes *finite B*
shows *card {f ∈ (A →_E B) . (∀ v ∈ d . f v = b)}/card (A →_E B) = 1/((card B) powi (card d))*
(is *card {f ∈ ?C . (∀ v ∈ d . f v = b)}/card ?C = 1/((card B) powi (card d))*
 $\langle \text{proof} \rangle$

lemma *card-PiE-val-indiv-eq*:
assumes *finite A*
assumes *b ∈ B*
assumes *d ∈ A*
assumes *B ≠ {}*
assumes *finite B*
shows *card {f ∈ (A →_E B) . f d = b}/card (A →_E B) = 1/(card B)*
(is *card {f ∈ ?C . f d = b}/card ?C = 1/(card B))*
 $\langle \text{proof} \rangle$

lemma *prob-uniform-ex-fun-space*:
assumes *finite A*
assumes *b ∈ B*
assumes *d ⊆ A*
assumes *B ≠ {}*
assumes *A ≠ {}*
assumes *finite B*
shows *prob-space.prob (uniform-count-measure (A →_E B)) {f ∈ (A →_E B) . (∀ v ∈ d . f v = b)} = 1/((card B) powi (card d))*
 $\langle \text{proof} \rangle$

proposition *integrable-uniform-count-measure-finite*:
fixes *g :: 'a ⇒ 'b::{{banach, second-countable-topology}}*
shows *finite A ⇒ integrable (uniform-count-measure A) g*
 $\langle \text{proof} \rangle$

end

4 Conditional Probability Library Extensions

```
theory Cond-Prob-Extensions
imports
  Prob-Events-Extras
  Design-Theory.Multisets-Extras
begin

4.1 Miscellaneous Set and List Lemmas

lemma nth-image-tl:
  assumes xs ≠ []
  shows nth xs ` {1.. xs} = set(tl xs)
  ⟨proof⟩

lemma exists-list-card:
  assumes finite S
  obtains xs where set xs = S and length xs = card S
  ⟨proof⟩

lemma bij-betw-inter-empty:
  assumes bij-betw f A B
  assumes A' ⊆ A
  assumes A'' ⊆ A
  assumes A' ∩ A'' = {}
  shows f ` A' ∩ f ` A'' = {}
  ⟨proof⟩

lemma bij-betw-image-comp-eq:
  assumes bij-betw g T S
  shows (F ∘ g) ` T = F ` S
  ⟨proof⟩

lemma prod-card-image-set-eq:
  assumes bij-betw f {0.. S} S
  assumes finite S
  shows (∏ i ∈ {n.. S}) . g (f i) = (∏ i ∈ f ` {n.. S} . g i)
  ⟨proof⟩

lemma set-take-distinct-elem-not:
  assumes distinct xs
  assumes i < length xs
  shows xs ! i ∉ set (take i xs)
  ⟨proof⟩
```

4.2 Conditional Probability Basics

```
context prob-space
begin
```

Abbreviation to mirror mathematical notations

abbreviation cond-prob-ev :: 'a set \Rightarrow 'a set \Rightarrow real ($\mathcal{P}'(- \mid -')$) **where**
 $\mathcal{P}(B \mid A) \equiv \mathcal{P}(x \text{ in } M. (x \in B) \mid (x \in A))$

lemma cond-prob-inter: $\mathcal{P}(B \mid A) = \mathcal{P}(\omega \text{ in } M. (\omega \in B \cap A)) / \mathcal{P}(\omega \text{ in } M. (\omega \in A))$
 $\langle proof \rangle$

lemma cond-prob-ev-def:
assumes $A \in \text{events}$ $B \in \text{events}$
shows $\mathcal{P}(B \mid A) = \text{prob}(A \cap B) / \text{prob } A$
 $\langle proof \rangle$

lemma measurable-in-ev:
assumes $A \in \text{events}$
shows Measurable.pred $M (\lambda x . x \in A)$
 $\langle proof \rangle$

lemma measure-uniform-measure-eq-cond-prob-ev:
assumes $A \in \text{events}$ $B \in \text{events}$
shows $\mathcal{P}(A \mid B) = \mathcal{P}(x \text{ in uniform-measure } M \{x \in \text{space } M. x \in B\}. x \in A)$
 $\langle proof \rangle$

lemma measure-uniform-measure-eq-cond-prob-ev2:
assumes $A \in \text{events}$ $B \in \text{events}$
shows $\mathcal{P}(A \mid B) = \text{measure}(\text{uniform-measure } M \{x \in \text{space } M. x \in B\}) A$
 $\langle proof \rangle$

lemma measure-uniform-measure-eq-cond-prob-ev3:
assumes $A \in \text{events}$ $B \in \text{events}$
shows $\mathcal{P}(A \mid B) = \text{measure}(\text{uniform-measure } M B) A$
 $\langle proof \rangle$

lemma prob-space-cond-prob-uniform:
assumes $\text{prob}(\{x \in \text{space } M. Q x\}) > 0$
shows prob-space (uniform-measure $M \{x \in \text{space } M. Q x\}$)
 $\langle proof \rangle$

lemma prob-space-cond-prob-event:
assumes $\text{prob } B > 0$
shows prob-space (uniform-measure $M B$)
 $\langle proof \rangle$

Note this case shouldn't be used. Conditional probability should have > 0 assumption

lemma cond-prob-empty: $\mathcal{P}(B \mid \{\}) = 0$
 $\langle proof \rangle$

lemma cond-prob-space: $\mathcal{P}(A \mid \text{space } M) = \mathcal{P}(w \text{ in } M . w \in A)$

$\langle proof \rangle$

lemma *cond-prob-space-ev*: **assumes** $A \in events$ **shows** $\mathcal{P}(A \mid space M) = prob A$
 $\langle proof \rangle$

lemma *cond-prob-UNIV*: $\mathcal{P}(A \mid UNIV) = \mathcal{P}(w \text{ in } M . w \in A)$
 $\langle proof \rangle$

lemma *cond-prob-UNIV-ev*: $A \in events \implies \mathcal{P}(A \mid UNIV) = prob A$
 $\langle proof \rangle$

lemma *cond-prob-neg*:
assumes $A \in events B \in events$
assumes $prob A > 0$
shows $\mathcal{P}((space M - B) \mid A) = 1 - \mathcal{P}(B \mid A)$
 $\langle proof \rangle$

4.3 Bayes Theorem

lemma *prob-intersect-A*:
assumes $A \in events B \in events$
shows $prob(A \cap B) = prob A * \mathcal{P}(B \mid A)$
 $\langle proof \rangle$

lemma *prob-intersect-B*:
assumes $A \in events B \in events$
shows $prob(A \cap B) = prob B * \mathcal{P}(A \mid B)$
 $\langle proof \rangle$

theorem *Bayes-theorem*:
assumes $A \in events B \in events$
shows $prob B * \mathcal{P}(A \mid B) = prob A * \mathcal{P}(B \mid A)$
 $\langle proof \rangle$

corollary *Bayes-theorem-div*:
assumes $A \in events B \in events$
shows $\mathcal{P}(A \mid B) = (prob A * \mathcal{P}(B \mid A)) / (prob B)$
 $\langle proof \rangle$

lemma *cond-prob-dual-intersect*:
assumes $A \in events B \in events C \in events$
assumes $prob C \neq 0$
shows $\mathcal{P}(A \mid (B \cap C)) = \mathcal{P}(A \cap B \mid C) / \mathcal{P}(B \mid C)$ (**is** $?LHS = ?RHS$)
 $\langle proof \rangle$

lemma *cond-prob-ev-double*:
assumes $A \in events B \in events C \in events$

```

assumes prob C > 0
shows  $\mathcal{P}(x \text{ in } (\text{uniform-measure } M \text{ } C). (x \in A) \mid (x \in B)) = \mathcal{P}(A \mid (B \cap C))$ 
⟨proof⟩

```

```

lemma cond-prob-inter-set-lt:
assumes A ∈ events B ∈ events AS ⊆ events
assumes finite AS
shows  $\mathcal{P}((A \cap (\bigcap AS)) \mid B) \leq \mathcal{P}(A \mid B)$  (is ?LHS ≤ ?RHS)
⟨proof⟩

```

4.4 Conditional Probability Multiplication Rule

Many list and indexed variations of this lemma

```

lemma prob-cond-Inter-List:
assumes xs ≠ []
assumes  $\bigwedge A. A \in \text{set } xs \implies A \in \text{events}$ 
shows prob  $(\bigcap (\text{set } xs)) = \text{prob} (\text{hd } xs) * (\prod i = 1..<(\text{length } xs) .$ 
 $\mathcal{P}((xs ! i) \mid (\bigcap (\text{set } (\text{take } i xs )))))$ 
⟨proof⟩

```

```

lemma prob-cond-Inter-index:
fixes n :: nat
assumes n > 0
assumes F ‘{0..<n} ⊆ events
shows prob  $(\bigcap (F ‘\{0..<n\})) = \text{prob} (F 0) * (\prod i \in \{1..<n\} .$ 
 $\mathcal{P}(F i \mid (\bigcap (F ‘\{0..<i\})))$ 
⟨proof⟩

```

```

lemma prob-cond-Inter-index-compl:
fixes n :: nat
assumes n > 0
assumes F ‘{0..<n} ⊆ events
shows prob  $(\bigcap x \in \{0..<n\} . \text{space } M - F x) = \text{prob} (\text{space } M - F 0) * (\prod i \in \{1..<n\} .$ 
 $\mathcal{P}(\text{space } M - F i \mid (\bigcap j \in \{0..<i\}. \text{space } M - F j))$ 
⟨proof⟩

```

```

lemma prob-cond-Inter-take-cond:
assumes xs ≠ []
assumes set xs ⊆ events
assumes S ⊆ events
assumes S ≠ {}
assumes finite S
assumes prob  $(\bigcap S) > 0$ 
shows  $\mathcal{P}((\bigcap (\text{set } xs)) \mid (\bigcap S)) = (\prod i = 0..<(\text{length } xs) . \mathcal{P}((xs ! i) \mid (\bigcap (\text{set } (\text{take } i xs ) \cup S))))$ 
⟨proof⟩

```

```

lemma prob-cond-Inter-index-cond-set:
  fixes n :: nat
  assumes n > 0
  assumes finite E
  assumes E ≠ {}
  assumes E ⊆ events
  assumes F ‘ {0..<n} ⊆ events
  assumes prob (⋂ E) > 0
  shows P((⋂(F ‘ {0..<n})) | (⋂ E)) = (Π i ∈ {0..<n}. P(F i | (⋂((F ‘ {0..<i}) ∪ E))))
  ⟨proof⟩

lemma prob-cond-Inter-index-cond-compl-set:
  fixes n :: nat
  assumes n > 0
  assumes finite E
  assumes E ≠ {}
  assumes E ⊆ events
  assumes F ‘ {0..<n} ⊆ events
  assumes prob (⋂ E) > 0
  shows P((⋂((- (space M) ‘ F ‘ {0..<n}))) | (⋂ E)) =
    (Π i = 0..<n . P((space M – F i) | (⋂((- (space M) ‘ F ‘ {0..<i}) ∪ E))))
  ⟨proof⟩

lemma prob-cond-Inter-index-cond:
  fixes n :: nat
  assumes n > 0
  assumes n < m
  assumes F ‘ {0..<m} ⊆ events
  assumes prob (⋂ j ∈ {n..<m}. F j) > 0
  shows P((⋂(F ‘ {0..<n})) | (⋂ j ∈ {n..<m} . F j)) = (Π i ∈ {0..<n}. P(F i | (⋂((F ‘ {0..<i}) ∪ (F ‘ {n..<m})))))
  ⟨proof⟩

lemma prob-cond-Inter-index-cond-compl:
  fixes n :: nat
  assumes n > 0
  assumes n < m
  assumes F ‘ {0..<m} ⊆ events
  assumes prob (⋂ j ∈ {n..<m}. F j) > 0
  shows P((⋂((- (space M) ‘ F ‘ {0..<n}))) | (⋂(F ‘ {n..<m}))) =
    (Π i = 0..<n . P((space M – F i) | (⋂((- (space M) ‘ F ‘ {0..<i}) ∪ (F ‘ {n..<m})))))
  ⟨proof⟩

lemma prob-cond-Inter-take-cond-neg:
  assumes xs ≠ []
  assumes set xs ⊆ events

```

```

assumes  $S \subseteq events$ 
assumes  $S \neq \{\}$ 
assumes  $finite\ S$ 
assumes  $prob(\bigcap S) > 0$ 
shows  $\mathcal{P}((\bigcap((-)(space\ M)\ ` (set\ xs))) \mid (\bigcap S)) =$ 
 $(\prod i = 0..<(length\ xs) . \mathcal{P}((space\ M - xs ! i) \mid (\bigcap((-)(space\ M)\ ` (set\ (take$ 
 $i\ xs)) \cup S))))$ 
⟨proof⟩

lemma prob-cond-Inter-List-Index:
assumes  $xs \neq []$ 
assumes  $set\ xs \subseteq events$ 
shows  $prob(\bigcap(set\ xs)) = prob(hd\ xs) * (\prod i = 1..<(length\ xs) .$ 
 $\mathcal{P}((xs ! i) \mid (\bigcap j \in \{0..<i\} . xs ! j)))$ 
⟨proof⟩

lemma obtains-prob-cond-Inter-index:
assumes  $S \neq \{\}$ 
assumes  $S \subseteq events$ 
assumes  $finite\ S$ 
obtains  $xs$  where  $set\ xs = S$  and  $length\ xs = card\ S$  and
 $prob(\bigcap S) = prob(hd\ xs) * (\prod i = 1..<(length\ xs) . \mathcal{P}((xs ! i) \mid (\bigcap j \in \{0..<i\}$ 
 $. xs ! j)))$ 
⟨proof⟩

lemma obtain-list-index:
assumes  $bij\text{-}betw\ g\ \{0..<card\ S\}\ S$ 
assumes  $finite\ S$ 
obtains  $xs$  where  $set\ xs = S$  and  $\bigwedge i . i \in \{0..<card\ S\} \implies g\ i = xs ! i$  and
 $distinct\ xs$ 
⟨proof⟩

lemma prob-cond-inter-fn:
assumes  $bij\text{-}betw\ g\ \{0..<card\ S\}\ S$ 
assumes  $finite\ S$ 
assumes  $S \neq \{\}$ 
assumes  $S \subseteq events$ 
shows  $prob(\bigcap S) = prob(g\ 0) * (\prod i \in \{1..<(card\ S)\} . \mathcal{P}(g\ i \mid (\bigcap(g\ ` \{0..<i\}))))$ 
⟨proof⟩

lemma prob-cond-inter-obtain-fn:
assumes  $S \neq \{\}$ 
assumes  $S \subseteq events$ 
assumes  $finite\ S$ 
obtains  $f$  where  $bij\text{-}betw\ f\ \{0..<card\ S\}\ S$  and
 $prob(\bigcap S) = prob(f\ 0) * (\prod i \in \{1..<(card\ S)\} . \mathcal{P}(f\ i \mid (\bigcap(f\ ` \{0..<i\}))))$ 
⟨proof⟩

```

```

lemma prob-cond-inter-obtain-fn-compl:
  assumes  $S \neq \{\}$ 
  assumes  $S \subseteq \text{events}$ 
  assumes  $\text{finite } S$ 
  obtains  $f$  where  $\text{bij-betw } f \{0..<\text{card } S\} S$  and  $\text{prob} (\bigcap ((-) (\text{space } M) ` S))$ 
=  $\text{prob} (\text{space } M - f 0) * (\prod i \in \{1..<(\text{card } S)\} . \mathcal{P}(\text{space } M - f i | (\bigcap ((-) (\text{space } M) ` f ` \{0..<i\})))$ 
⟨proof⟩

lemma prob-cond-Inter-index-cond-fn:
  assumes  $I \neq \{\}$ 
  assumes  $\text{finite } I$ 
  assumes  $\text{finite } E$ 
  assumes  $E \neq \{\}$ 
  assumes  $E \subseteq \text{events}$ 
  assumes  $F ` I \subseteq \text{events}$ 
  assumes  $\text{prob} (\bigcap E) > 0$ 
  assumes  $bb: \text{bij-betw } g \{0..<\text{card } I\} I$ 
  shows  $\mathcal{P}((\bigcap (F ` g ` \{0..<\text{card } I\})) | (\bigcap E)) =$ 
     $(\prod i \in \{0..<\text{card } I\}. \mathcal{P}(F(g i) | (\bigcap ((F ` g ` \{0..<i\}) \cup E))))$ 
⟨proof⟩

lemma prob-cond-Inter-index-cond-obtains:
  assumes  $I \neq \{\}$ 
  assumes  $\text{finite } I$ 
  assumes  $\text{finite } E$ 
  assumes  $E \neq \{\}$ 
  assumes  $E \subseteq \text{events}$ 
  assumes  $F ` I \subseteq \text{events}$ 
  assumes  $\text{prob} (\bigcap E) > 0$ 
  obtains  $g$  where  $\text{bij-betw } g \{0..<\text{card } I\} I$  and  $\mathcal{P}((\bigcap (F ` g ` \{0..<\text{card } I\})) | (\bigcap E)) =$ 
     $(\prod i \in \{0..<\text{card } I\}. \mathcal{P}(F(g i) | (\bigcap ((F ` g ` \{0..<i\}) \cup E))))$ 
⟨proof⟩

lemma prob-cond-Inter-index-cond-compl-fn:
  assumes  $I \neq \{\}$ 
  assumes  $\text{finite } I$ 
  assumes  $\text{finite } E$ 
  assumes  $E \neq \{\}$ 
  assumes  $E \subseteq \text{events}$ 
  assumes  $F ` I \subseteq \text{events}$ 
  assumes  $\text{prob} (\bigcap E) > 0$ 
  assumes  $bb: \text{bij-betw } g \{0..<\text{card } I\} I$ 
  shows  $\mathcal{P}((\bigcap Aj \in I . \text{space } M - F Aj) | (\bigcap E)) =$ 
     $(\prod i \in \{0..<\text{card } I\}. \mathcal{P}(\text{space } M - F(g i) | (\bigcap (((\lambda Aj. \text{space } M - F Aj) ` g ` \{0..<i\}) \cup E))))$ 
⟨proof⟩

```

```

lemma prob-cond-Inter-index-cond-compl-obtains:
  assumes I ≠ {}
  assumes finite I
  assumes finite E
  assumes E ≠ {}
  assumes E ⊆ events
  assumes F ‘ I ⊆ events
  assumes prob (∩ E) > 0
  obtains g where bij-betw g {0..<card I} I and P((∩ Aj ∈ I . space M – F Aj)
| (∩ E)) =
  (Π i ∈ {0..<card I}. P(space M – F (g i) | (∩ (((λAj. space M – F Aj) ‘ g ‘
{0..<i}) ∪ E))))  

⟨proof⟩

lemma prob-cond-inter-index-fn2:
  assumes F ‘ S ⊆ events
  assumes finite S
  assumes card S > 0
  assumes bij-betw g {0..<card S} S
  shows prob (∩(F ‘ S)) = prob (F (g 0)) * (Π i ∈ {1..<(card S)} . P(F (g i) |
(∩(F ‘ g ‘ {0..<i}))))  

⟨proof⟩

lemma prob-cond-inter-index-fn:
  assumes F ‘ S ⊆ events
  assumes finite S
  assumes S ≠ {}
  assumes bij-betw g {0..<card S} S
  shows prob (∩(F ‘ S)) = prob (F (g 0)) * (Π i ∈ {1..<(card S)} . P(F (g i) |
(∩(F ‘ g ‘ {0..<i}))))  

⟨proof⟩

lemma prob-cond-inter-index-obtain-fn:
  assumes F ‘ S ⊆ events
  assumes finite S
  assumes S ≠ {}
  obtains g where bij-betw g {0..<card S} S and
    prob (∩(F ‘ S)) = prob (F (g 0)) * (Π i ∈ {1..<(card S)} . P(F (g i) | (∩(F ‘
g ‘ {0..<i}))))  

⟨proof⟩

lemma prob-cond-inter-index-fn-compl:
  assumes S ≠ {}
  assumes F ‘ S ⊆ events
  assumes finite S
  assumes bij-betw f {0..<card S} S
  shows prob (∩((-) (space M) ‘ F ‘ S)) = prob (space M – F (f 0)) *
    (Π i ∈ {1..<(card S)} . P(space M – F (f i) | (∩((-) (space M) ‘ F ‘ f ‘

```

```
{0..<i})))
⟨proof⟩
```

```
lemma prob-cond-inter-index-obtain-fn-compl:
  assumes S ≠ {}
  assumes F ‘ S ⊆ events
  assumes finite S
  obtains f where bij-betw f {0..<card S} S and
    prob (⋂((-) (space M) ‘ F ‘ S)) = prob (space M – F (f 0)) *
    (Π i ∈ {1..<(card S)} . P(space M – F (f i) | (⋂((-) (space M) ‘ F ‘ f ‘
    {0..<i})))
  ⟨proof⟩
```

```
lemma prob-cond-Inter-take:
  assumes S ≠ {}
  assumes S ⊆ events
  assumes finite S
  obtains xs where set xs = S and length xs = card S and
    prob (⋂ S) = prob (hd xs) * (Π i = 1..<(length xs) . P((xs ! i) | (⋂(set (take i
    xs )))))
  ⟨proof⟩
```

```
lemma prob-cond-Inter-set-bound:
  assumes A ≠ {}
  assumes A ⊆ events
  assumes finite A
  assumes ⋀ Ai . f Ai ≥ 0 ∧ f Ai ≤ 1
  assumes ⋀ Ai S. Ai ∈ A ⇒ S ⊆ A – {Ai} ⇒ S ≠ {} ⇒ P(Ai | (⋂ S)) ≥ f
  Ai
  assumes ⋀ Ai. Ai ∈ A ⇒ prob Ai ≥ f Ai
  shows prob (⋂ A) ≥ (Π a' ∈ A . f a')
  ⟨proof⟩
end

end
```

5 Independent Events

```
theory Indep-Events imports Cond-Prob-Extensions
begin
```

5.1 More bijection helpers

```
lemma bij-betw-obtain-subsetr:
  assumes bij-betw f A B
  assumes A' ⊆ A
  obtains B' where B' ⊆ B and B' = f ‘ A'
```

$\langle proof \rangle$

```

lemma bij-betw-obtain-subsetl:
  assumes bij-betw f A B
  assumes B' ⊆ B
  obtains A' where A' ⊆ A and B' = f ` A'
  ⟨proof⟩

```

```

lemma bij-betw-remove: bij-betw f A B  $\implies$  a ∈ A  $\implies$  bij-betw f (A - {a}) (B - {f a})
  ⟨proof⟩

```

5.2 Independent Event Extensions

Extensions on both the indep_event definition and the indep_events definition

```

context prob-space
begin

```

```

lemma indep-eventsD: indep-events A I  $\implies$  (A I ⊆ events)  $\implies$  J ⊆ I  $\implies$  J ≠ {}
 $\implies$  finite J  $\implies$ 
  prob (⋂ j ∈ J. A j) = (Π j ∈ J. prob (A j))
  ⟨proof⟩

```

```

lemma
  assumes indep: indep-event A B
  shows indep-eventD-ev1: A ∈ events
    and indep-eventD-ev2: B ∈ events
  ⟨proof⟩

```

```

lemma indep-eventD:
  assumes ie: indep-event A B
  shows prob (A ∩ B) = prob (A) * prob (B)
  ⟨proof⟩

```

```

lemma indep-eventI[intro]:
  assumes ev: A ∈ events B ∈ events
    and indep: prob (A ∩ B) = prob A * prob B
  shows indep-event A B
  ⟨proof⟩

```

Alternate set definition - when no possibility of duplicate objects

```

definition indep-events-set :: 'a set set  $\Rightarrow$  bool where
  indep-events-set E  $\equiv$  (E ⊆ events  $\wedge$  (∀ J. J ⊆ E  $\longrightarrow$  finite J  $\longrightarrow$  J ≠ {}  $\longrightarrow$  prob (J) = (Π i ∈ J. prob i)))

```

```

lemma indep-events-setI[intro]: E ⊆ events  $\implies$  (∀ J. J ⊆ E  $\implies$  finite J  $\implies$  J ≠ {}  $\implies$ 
  prob (J) = (Π i ∈ J. prob i))  $\implies$  indep-events-set E

```

(proof)

lemma *indep-events-subset*:

indep-events-set E \longleftrightarrow $(\forall J \subseteq E. \text{indep-events-set } J)$
(proof)

lemma *indep-events-subset2*:

indep-events-set E $\implies J \subseteq E \implies \text{indep-events-set } J$
(proof)

lemma *indep-events-set-events*: *indep-events-set E* $\implies (\bigwedge e. e \in E \implies e \in \text{events})$

(proof)

lemma *indep-events-set-events-ss*: *indep-events-set E* $\implies E \subseteq \text{events}$

(proof)

lemma *indep-events-set-probs*: *indep-events-set E* $\implies J \subseteq E \implies \text{finite } J \implies J \neq \{\}$

$\text{prob}(\bigcap J) = (\prod_{i \in J.} \text{prob } i)$
(proof)

lemma *indep-events-set-prod-all*: *indep-events-set E* $\implies \text{finite } E \implies E \neq \{\}$ \implies

$\text{prob}(\bigcap E) = \text{prod prob } E$
(proof)

lemma *indep-events-not-contain-compl*:

assumes *indep-events-set E*
assumes $A \in E$
assumes $\text{prob } A > 0 \text{ prob } A < 1$
shows $(\text{space } M - A) \notin E$ (**is** $?A' \notin E$)
(proof)

lemma *indep-events-contain-compl-prob01*:

assumes *indep-events-set E*
assumes $A \in E$
assumes $\text{space } M - A \in E$
shows $\text{prob } A = 0 \vee \text{prob } A = 1$
(proof)

lemma *indep-events-set-singleton*:

assumes $A \in \text{events}$
shows *indep-events-set {A}*
(proof)

lemma *indep-events-pairs*:

assumes *indep-events-set S*
assumes $A \in S \ B \in S \ A \neq B$

```

shows indep-event A B
⟨proof⟩

lemma indep-events-inter-pairs:
  assumes indep-events-set S
  assumes finite A finite B
  assumes A ≠ {} B ≠ {}
  assumes A ⊆ S B ⊆ S A ∩ B = {}
  shows indep-event (∩ A) (∩ B)
⟨proof⟩

lemma indep-events-inter-single:
  assumes indep-events-set S
  assumes finite B
  assumes B ≠ {}
  assumes A ∈ S B ⊆ S A ∉ B
  shows indep-event A (∩ B)
⟨proof⟩

lemma indep-events-set-prob1:
  assumes A ∈ events
  assumes prob A = 1
  assumes A ∉ S
  assumes indep-events-set S
  shows indep-events-set (S ∪ {A})
⟨proof⟩

lemma indep-events-set-prob0:
  assumes A ∈ events
  assumes prob A = 0
  assumes A ∉ S
  assumes indep-events-set S
  shows indep-events-set (S ∪ {A})
⟨proof⟩

lemma indep-event-commute:
  assumes indep-event A B
  shows indep-event B A
⟨proof⟩

```

Showing complement operation maintains independence

```

lemma indep-event-one-compl:
  assumes indep-event A B
  shows indep-event A (space M - B)
⟨proof⟩

lemma indep-event-one-compl-rev:
  assumes B ∈ events

```

```

assumes indep-event A (space M – B)
shows indep-event A B
⟨proof⟩

lemma indep-event-double-compl: indep-event A B  $\implies$  indep-event (space M – A) (space M – B)
shows indep-event (space M – A) (space M – B)  $\implies$  indep-event A B
⟨proof⟩

lemma indep-event-double-compl-rev: A ∈ events  $\implies$  B ∈ events  $\implies$ 
indep-event (space M – A) (space M – B)  $\implies$  indep-event A B
⟨proof⟩

lemma indep-events-set-one-compl:
assumes indep-events-set S
assumes A ∈ S
shows indep-events-set ((space M – A) ∪ (S – {A}))
⟨proof⟩

lemma indep-events-set-update-compl:
assumes indep-events-set E
assumes E = A ∪ B
assumes A ∩ B = {}
assumes finite E
shows indep-events-set (((–) (space M) ‘ A) ∪ B)
⟨proof⟩

lemma indep-events-set-compl:
assumes indep-events-set E
assumes finite E
shows indep-events-set ((λ e. space M – e) ‘ E)
⟨proof⟩

lemma indep-event-empty:
assumes A ∈ events
shows indep-event A {}
⟨proof⟩

lemma indep-event-compl-inter:
assumes indep-event A C
assumes B ∈ events
assumes indep-event A (B ∩ C)
shows indep-event A ((space M – B) ∩ C)
⟨proof⟩

lemma indep-events-index-subset:
indep-events F E  $\longleftrightarrow$   $(\forall J \subseteq E. \text{indep-events } F J)$ 

```

$\langle proof \rangle$

lemma *indep-events-index-subset2*:

indep-events F E $\implies J \subseteq E \implies \text{indep-events } F J$
 $\langle proof \rangle$

lemma *indep-events-events-ss*: *indep-events F E* $\implies F ` E \subseteq \text{events}$
 $\langle proof \rangle$

lemma *indep-events-events*: *indep-events F E* $\implies (\bigwedge e. e \in E \implies F e \in \text{events})$
 $\langle proof \rangle$

lemma *indep-events-probs*: *indep-events F E* $\implies J \subseteq E \implies \text{finite } J \implies J \neq \{\}$
 $\implies \text{prob}(\bigcap(F ` J)) = (\prod i \in J. \text{prob}(F i))$
 $\langle proof \rangle$

lemma *indep-events-prod-all*: *indep-events F E* $\implies \text{finite } E \implies E \neq \{\} \implies \text{prob}(\bigcap(F ` E)) = (\prod i \in E. \text{prob}(F i))$
 $\langle proof \rangle$

lemma *indep-events-ev-not-contain-compl*:

assumes *indep-events F E*
 assumes $A \in E$
 assumes $\text{prob}(F A) > 0$ $\text{prob}(F A) < 1$
 shows $(\text{space } M - F A) \notin F ` E$ (**is** $?A' \notin F ` E$)
 $\langle proof \rangle$

lemma *indep-events-singleton*:

assumes $F A \in \text{events}$
 shows *indep-events F {A}*
 $\langle proof \rangle$

lemma *indep-events-ev-pairs*:

assumes *indep-events F S*
 assumes $A \in S$ $B \in S$ $A \neq B$
 shows *indep-event (F A) (F B)*
 $\langle proof \rangle$

lemma *indep-events-ev-inter-pairs*:

assumes *indep-events F S*
 assumes $\text{finite } A$ $\text{finite } B$
 assumes $A \neq \{\}$ $B \neq \{\}$
 assumes $A \subseteq S$ $B \subseteq S$ $A \cap B = \{\}$
 shows *indep-event ((\bigcap(F ` A)) (\bigcap(F ` B)))*
 $\langle proof \rangle$

lemma *indep-events-ev-inter-single*:

```

assumes indep-events  $F S$ 
assumes finite  $B$ 
assumes  $B \neq \{\}$ 
assumes  $A \in S$   $B \subseteq S$   $A \notin B$ 
shows indep-event  $(F A) (\bigcap (F \setminus B))$ 
⟨proof⟩

lemma indep-events-fn-eq:
assumes  $\bigwedge Ai. Ai \in E \implies F Ai = G Ai$ 
assumes indep-events  $F E$ 
shows indep-events  $G E$ 
⟨proof⟩

lemma indep-events-fn-eq-iff:
assumes  $\bigwedge Ai. Ai \in E \implies F Ai = G Ai$ 
shows indep-events  $F E \longleftrightarrow \text{indep-events } G E$ 
⟨proof⟩

lemma indep-events-one-compl:
assumes indep-events  $F S$ 
assumes  $A \in S$ 
shows indep-events  $(\lambda i. \text{if } (i = A) \text{ then } (\text{space } M - F i) \text{ else } F i) S$  (is indep-events  $?G S$ )
⟨proof⟩

lemma indep-events-update-compl:
assumes indep-events  $F E$ 
assumes  $E = A \cup B$ 
assumes  $A \cap B = \{\}$ 
assumes finite  $E$ 
shows indep-events  $(\lambda Ai. \text{if } (Ai \in A) \text{ then } (\text{space } M - (F Ai)) \text{ else } (F Ai)) E$ 
⟨proof⟩

lemma indep-events-compl:
assumes indep-events  $F E$ 
assumes finite  $E$ 
shows indep-events  $(\lambda Ai. \text{space } M - F Ai) E$ 
⟨proof⟩

lemma indep-events-impl-inj-on:
assumes finite  $A$ 
assumes indep-events  $F A$ 
assumes  $\bigwedge A'. A' \in A \implies \text{prob } (F A') > 0 \wedge \text{prob } (F A') < 1$ 
shows inj-on  $F A$ 
⟨proof⟩

lemma indep-events-imp-set:
assumes finite  $A$ 
assumes indep-events  $F A$ 

```

```

assumes  $\bigwedge A' . A' \in A \implies \text{prob}(F A') > 0 \wedge \text{prob}(F A') < 1$ 
shows indep-events-set( $F`A$ )
⟨proof⟩

```

```

lemma indep-event-set-equiv-bij:
assumes bij-betw  $F A E$ 
assumes finite  $E$ 
shows indep-events-set  $E \longleftrightarrow \text{indep-events } F A$ 
⟨proof⟩

```

5.3 Mutual Independent Events

Note, set based version only if no duplicates in usage case. The *mutual_indep_events* definition is more general and recommended

```

definition mutual-indep-set:: ' $a$  set  $\Rightarrow$  ' $a$  set set  $\Rightarrow$  bool'
where mutual-indep-set  $A S \longleftrightarrow A \in \text{events} \wedge S \subseteq \text{events} \wedge (\forall T \subseteq S . T \neq \{\}) \rightarrow \text{prob}(A \cap (\bigcap T)) = \text{prob } A * \text{prob } (\bigcap T)$ 

```

```

lemma mutual-indep-setI[intro]:  $A \in \text{events} \implies S \subseteq \text{events} \implies (\bigwedge T . T \subseteq S \implies T \neq \{\}) \implies \text{prob}(A \cap (\bigcap T)) = \text{prob } A * \text{prob } (\bigcap T) \implies \text{mutual-indep-set } A S$ 
⟨proof⟩

```

```

lemma mutual-indep-setD[dest]: mutual-indep-set  $A S \implies T \subseteq S \implies T \neq \{\}$ 
 $\implies \text{prob}(A \cap (\bigcap T)) = \text{prob } A * \text{prob } (\bigcap T)$ 
⟨proof⟩

```

```

lemma mutual-indep-setD2[dest]: mutual-indep-set  $A S \implies A \in \text{events}$ 
⟨proof⟩

```

```

lemma mutual-indep-setD3[dest]: mutual-indep-set  $A S \implies S \subseteq \text{events}$ 
⟨proof⟩

```

```

lemma mutual-indep-subset: mutual-indep-set  $A S \implies T \subseteq S \implies \text{mutual-indep-set } A T$ 
⟨proof⟩

```

```

lemma mutual-indep-event-set-defD:
assumes mutual-indep-set  $A S$ 
assumes finite  $T$ 
assumes  $T \subseteq S$ 
assumes  $T \neq \{\}$ 
shows indep-event  $A (\bigcap T)$ 
⟨proof⟩

```

```

lemma mutual-indep-event-defI:  $A \in \text{events} \implies S \subseteq \text{events} \implies (\bigwedge T . T \subseteq S \implies T \neq \{\}) \implies$ 

```

indep-event $A (\cap T)) \implies mutual-indep-set A S$
 $\langle proof \rangle$

lemma *mutual-indep-singleton-event*: $mutual-indep-set A S \implies B \in S \implies indep-event A B$
 $\langle proof \rangle$

lemma *mutual-indep-cond*:
assumes $A \in events$ **and** $T \subseteq events$ **and** *finite* T
and *mutual-indep-set* $A S$ **and** $T \subseteq S$ **and** $T \neq \{\}$ **and** *prob* $(\cap T) \neq 0$
shows $\mathcal{P}(A |(\cap T)) = prob A$
 $\langle proof \rangle$

lemma *mutual-indep-cond-full*:
assumes $A \in events$ **and** $S \subseteq events$ **and** *finite* S
and *mutual-indep-set* $A S$ **and** $S \neq \{\}$ **and** *prob* $(\cap S) \neq 0$
shows $\mathcal{P}(A |(\cap S)) = prob A$
 $\langle proof \rangle$

lemma *mutual-indep-cond-single*:
assumes $A \in events$ **and** $B \in events$
and *mutual-indep-set* $A S$ **and** $B \in S$ **and** *prob* $B \neq 0$
shows $\mathcal{P}(A |B) = prob A$
 $\langle proof \rangle$

lemma *mutual-indep-set-empty*: $A \in events \implies mutual-indep-set A \{\}$
 $\langle proof \rangle$

lemma *not-mutual-indep-set-itself*:
assumes *prob* $A > 0$ **and** *prob* $A < 1$
shows $\neg mutual-indep-set A \{A\}$
 $\langle proof \rangle$

lemma *is-mutual-indep-set-itself*:
assumes $A \in events$
assumes *prob* $A = 0 \vee prob A = 1$
shows *mutual-indep-set* $A \{A\}$
 $\langle proof \rangle$

lemma *mutual-indep-set-singleton*:
assumes *indep-event* $A B$
shows *mutual-indep-set* $A \{B\}$
 $\langle proof \rangle$

lemma *mutual-indep-set-one-compl*:
assumes *mutual-indep-set* $A S$
assumes *finite* S
assumes $B \in S$
shows *mutual-indep-set* $A (\{space M - B\} \cup S)$

$\langle proof \rangle$

```

lemma mutual-indep-events-set-update-compl:
  assumes mutual-indep-set X E
  assumes E = A ∪ B
  assumes A ∩ B = {}
  assumes finite E
  shows mutual-indep-set X (((-) (space M) ` A) ∪ B)
⟨proof⟩

```

```

lemma mutual-indep-events-compl:
  assumes finite S
  assumes mutual-indep-set A S
  shows mutual-indep-set A ((λ s . space M - s) ` S)
⟨proof⟩

```

```

lemma mutual-indep-set-all:
  assumes A ⊆ events
  assumes ⋀ Ai. Ai ∈ A ⇒ (mutual-indep-set Ai (A - {Ai}))
  shows indep-events-set A
⟨proof⟩

```

Preferred version using indexed notation

```

definition mutual-indep-events:: 'a set ⇒ (nat ⇒ 'a set) ⇒ nat set ⇒ bool
  where mutual-indep-events A F I ←→ A ∈ events ∧ (F ` I ⊆ events) ∧ (⋀ J ⊆ I . J ≠ {} → prob (A ∩ (∏ j ∈ J . F j)) = prob A * prob (∏ j ∈ J . F j))

```

```

lemma mutual-indep-eventsI[intro]: A ∈ events ⇒ (F ` I ⊆ events) ⇒ (⋀ J . J
  ⊆ I ⇒ J ≠ {} ⇒
    prob (A ∩ (∏ j ∈ J . F j)) = prob A * prob (∏ j ∈ J . F j)) ⇒ mu-
  tual-indep-events A F I
⟨proof⟩

```

```

lemma mutual-indep-eventsD[dest]: mutual-indep-events A F I ⇒ J ⊆ I ⇒ J
  ≠ {} ⇒ prob (A ∩ (∏ j ∈ J . F j)) = prob A * prob (∏ j ∈ J . F j)
⟨proof⟩

```

```

lemma mutual-indep-eventsD2[dest]: mutual-indep-events A F I ⇒ A ∈ events
⟨proof⟩

```

```

lemma mutual-indep-eventsD3[dest]: mutual-indep-events A F I ⇒ F ` I ⊆ events
⟨proof⟩

```

```

lemma mutual-indep-ev-subset: mutual-indep-events A F I ⇒ J ⊆ I ⇒ mu-
  tual-indep-events A F J
⟨proof⟩

```

```

lemma mutual-indep-event-defD:
  assumes mutual-indep-events A F I
  assumes finite J
  assumes J ⊆ I
  assumes J ≠ {}
  shows indep-event A (⋂ j ∈ J . F j)
  ⟨proof⟩

lemma mutual-ev-indep-event-defI: A ∈ events ⇒ F ‘ I ⊆ events ⇒ (⋀ J. J
  ⊆ I ⇒ J ≠ {} ⇒
    indep-event A (⋂ (F ‘ J))) ⇒ mutual-indep-events A F I
  ⟨proof⟩

lemma mutual-indep-ev-singleton-event:
  assumes mutual-indep-events A F I
  assumes B ∈ F ‘ I
  shows indep-event A B
  ⟨proof⟩

lemma mutual-indep-ev-singleton-event2:
  assumes mutual-indep-events A F I
  assumes i ∈ I
  shows indep-event A (F i)
  ⟨proof⟩

lemma mutual-indep-iff:
  shows mutual-indep-events A F I ←→ mutual-indep-set A (F ‘ I)
  ⟨proof⟩

lemma mutual-indep-ev-cond:
  assumes A ∈ events and F ‘ J ⊆ events and finite J
  and mutual-indep-events A F I and J ⊆ I and J ≠ {} and prob (⋂ (F ‘ J)) ≠ 0
  shows P(A |(⋂ (F ‘ J))) = prob A
  ⟨proof⟩

lemma mutual-indep-ev-cond-full:
  assumes A ∈ events and F ‘ I ⊆ events and finite I
  and mutual-indep-events A F I and I ≠ {} and prob (⋂ (F ‘ I)) ≠ 0
  shows P(A |(⋂ (F ‘ I))) = prob A
  ⟨proof⟩

lemma mutual-indep-ev-cond-single:
  assumes A ∈ events and B ∈ events
  and mutual-indep-events A F I and B ∈ F ‘ I and prob B ≠ 0
  shows P(A |B) = prob A
  ⟨proof⟩

lemma mutual-indep-ev-empty: A ∈ events ⇒ mutual-indep-events A F {}
  ⟨proof⟩

```

```

lemma not-mutual-indep-ev-itself:
  assumes prob A > 0 and prob A < 1 and A = F i
  shows  $\neg$  mutual-indep-events A F {i}
  ⟨proof⟩

lemma is-mutual-indep-ev-itself:
  assumes A ∈ events and A = F i
  assumes prob A = 0  $\vee$  prob A = 1
  shows mutual-indep-events A F {i}
  ⟨proof⟩

lemma mutual-indep-ev-singleton:
  assumes indep-event A (F i)
  shows mutual-indep-events A F {i}
  ⟨proof⟩

lemma mutual-indep-ev-one-compl:
  assumes mutual-indep-events A F I
  assumes finite I
  assumes i ∈ I
  assumes space M – F i = F j
  shows mutual-indep-events A F ({j} ∪ I)
  ⟨proof⟩

lemma mutual-indep-events-update-compl:
  assumes mutual-indep-events X F S
  assumes S = A ∪ B
  assumes A ∩ B = {}
  assumes finite S
  assumes bij-betw G A A'
  assumes  $\bigwedge i. i \in A \implies F(G i) = \text{space } M - F i$ 
  shows mutual-indep-events X F (A' ∪ B)
  ⟨proof⟩

lemma mutual-indep-ev-events-compl:
  assumes finite S
  assumes mutual-indep-events A F S
  assumes bij-betw G S S'
  assumes  $\bigwedge i. i \in S \implies F(G i) = \text{space } M - F i$ 
  shows mutual-indep-events A F S'
  ⟨proof⟩

```

Important lemma on relation between independence and mutual independence of a set

```

lemma mutual-indep-ev-set-all:
  assumes F ‘ I ⊆ events
  assumes  $\bigwedge i. i \in I \implies (\text{mutual-indep-events } (F i) F (I - \{i\}))$ 
  shows indep-events F I

```

```
<proof>
```

```
end  
end
```

6 The Basic Probabilistic Method Framework

This theory includes all aspects of step (3) and (4) of the basic method framework, which are purely probabilistic

```
theory Basic-Method imports Indep-Events  
begin
```

6.1 More Set and Multiset lemmas

```
lemma card-size-set-mset: card (set-mset A) ≤ size A  
<proof>
```

```
lemma Union-exists: {a ∈ A . ∃ b ∈ B . P a b} = (⋃ b ∈ B . {a ∈ A . P a b})  
<proof>
```

```
lemma Inter-forall: B ≠ {} ==> {a ∈ A . ∀ b ∈ B . P a b} = (⋂ b ∈ B . {a ∈ A . P a b})  
<proof>
```

```
lemma function-map-multi-filter-size:  
assumes image-mset F (mset-set A) = B and finite A  
shows card {a ∈ A . P (F a)} = size {# b ∈# B . P b #}  
<proof>
```

```
lemma bij-mset-obtain-set-elem:  
assumes image-mset F (mset-set A) = B  
assumes b ∈# B  
obtains a where a ∈ A and F a = b  
<proof>
```

```
lemma bij-mset-obtain-mset-elem:  
assumes finite A  
assumes image-mset F (mset-set A) = B  
assumes a ∈ A  
obtains b where b ∈# B and F a = b  
<proof>
```

```
lemma prod-fn-le1:  
fixes f :: 'c ⇒ ('d :: {comm-monoid-mult, linordered-semidom})  
assumes finite A  
assumes A ≠ {}  
assumes ⋀ y. y ∈ A ==> f y ≥ 0 ∧ f y < 1  
shows (∏ x ∈ A. f x) < 1
```

$\langle proof \rangle$

context prob-space
begin

6.2 Existence Lemmas

lemma prob-lt-one-obtain:

assumes $\{e \in space M . Q e\} \in events$
assumes $prob \{e \in space M . Q e\} < 1$
obtains e **where** $e \in space M$ **and** $\neg Q e$

$\langle proof \rangle$

lemma prob-gt-zero-obtain:

assumes $\{e \in space M . Q e\} \in events$
assumes $prob \{e \in space M . Q e\} > 0$
obtains e **where** $e \in space M$ **and** $Q e$

$\langle proof \rangle$

lemma inter-gt0-event:

assumes $F`I \subseteq events$
assumes $prob (\bigcap i \in I . (space M - (F i))) > 0$
shows $(\bigcap i \in I . (space M - (F i))) \in events$ **and** $(\bigcap i \in I . (space M - (F i))) \neq \{\}$

$\langle proof \rangle$

lemma obtain-intersection:

assumes $F`I \subseteq events$
assumes $prob (\bigcap i \in I . (space M - (F i))) > 0$
obtains e **where** $e \in space M$ **and** $\bigwedge i . i \in I \implies e \notin F i$

$\langle proof \rangle$

lemma obtain-intersection-prop:

assumes $F`I \subseteq events$
assumes $\bigwedge i . i \in I \implies F i = \{e \in space M . P e i\}$
assumes $prob (\bigcap i \in I . (space M - (F i))) > 0$
obtains e **where** $e \in space M$ **and** $\bigwedge i . i \in I \implies \neg P e i$

$\langle proof \rangle$

lemma not-in-big-union:

assumes $\bigwedge i . i \in A \implies e \notin i$
shows $e \notin (\bigcup A)$

$\langle proof \rangle$

lemma not-in-big-union-fn:

assumes $\bigwedge i . i \in A \implies e \notin F i$
shows $e \notin (\bigcup i \in A . F i)$

$\langle proof \rangle$

```

lemma obtain-intersection-union:
  assumes  $F`I \subseteq \text{events}$ 
  assumes  $\text{prob}(\bigcap i \in I . (\text{space } M - (F i))) > 0$ 
  obtains  $e$  where  $e \in \text{space } M$  and  $e \notin (\bigcup i \in I. F i)$ 
  ⟨proof⟩

```

6.3 Basic Bounds

Lemmas on the Complete Independence and Union bound

```

lemma complete-indep-bound1:
  assumes  $\text{finite } A$ 
  assumes  $A \neq \{\}$ 
  assumes  $A \subseteq \text{events}$ 
  assumes  $\text{indep-events-set } A$ 
  assumes  $\bigwedge a . a \in A \implies \text{prob } a < 1$ 
  shows  $\text{prob}(\text{space } M - (\bigcap A)) > 0$ 
  ⟨proof⟩

```

```

lemma complete-indep-bound1-index:
  assumes  $\text{finite } A$ 
  assumes  $A \neq \{\}$ 
  assumes  $F`A \subseteq \text{events}$ 
  assumes  $\text{indep-events } F A$ 
  assumes  $\bigwedge a . a \in A \implies \text{prob } (F a) < 1$ 
  shows  $\text{prob}(\text{space } M - (\bigcap (F`A))) > 0$ 
  ⟨proof⟩

```

```

lemma complete-indep-bound2:
  assumes  $\text{finite } A$ 
  assumes  $A \subseteq \text{events}$ 
  assumes  $\text{indep-events-set } A$ 
  assumes  $\bigwedge a . a \in A \implies \text{prob } a < 1$ 
  shows  $\text{prob}(\text{space } M - (\bigcup A)) > 0$ 
  ⟨proof⟩

```

```

lemma complete-indep-bound2-index:
  assumes  $\text{finite } A$ 
  assumes  $F`A \subseteq \text{events}$ 
  assumes  $\text{indep-events } F A$ 
  assumes  $\bigwedge a . a \in A \implies \text{prob } (F a) < 1$ 
  shows  $\text{prob}(\text{space } M - (\bigcup (F`A))) > 0$ 
  ⟨proof⟩

```

```

lemma complete-indep-bound3:
  assumes  $\text{finite } A$ 
  assumes  $A \neq \{\}$ 
  assumes  $F`A \subseteq \text{events}$ 
  assumes  $\text{indep-events } F A$ 
  assumes  $\bigwedge a . a \in A \implies \text{prob } (F a) < 1$ 

```

shows $\text{prob}(\bigcap a \in A. \text{space } M - F a) > 0$
 $\langle \text{proof} \rangle$

Combining complete independence with existence step

lemma *complete-indep-bound-obtain*:

assumes $\text{finite } A$
assumes $A \subseteq \text{events}$
assumes *indep-events-set* A
assumes $\bigwedge a . a \in A \implies \text{prob } a < 1$
obtains e **where** $e \in \text{space } M$ **and** $e \notin \bigcup A$

$\langle \text{proof} \rangle$

lemma *Union-bound-events*:

assumes $\text{finite } A$
assumes $A \subseteq \text{events}$
shows $\text{prob}(\bigcup A) \leq (\sum a \in A. \text{prob } a)$
 $\langle \text{proof} \rangle$

lemma *Union-bound-events-fun*:

assumes $\text{finite } A$
assumes $f : A \subseteq \text{events}$
shows $\text{prob}(\bigcup(f ' A)) \leq (\sum a \in A. \text{prob}(f a))$
 $\langle \text{proof} \rangle$

lemma *Union-bound-avoid*:

assumes $\text{finite } A$
assumes $(\sum a \in A. \text{prob } a) < 1$
assumes $A \subseteq \text{events}$
shows $\text{prob}(\text{space } M - \bigcup A) > 0$
 $\langle \text{proof} \rangle$

lemma *Union-bound-avoid-fun*:

assumes $\text{finite } A$
assumes $(\sum a \in A. \text{prob } (f a)) < 1$
assumes $f : A \subseteq \text{events}$
shows $\text{prob}(\text{space } M - \bigcup(f ' A)) > 0$
 $\langle \text{proof} \rangle$

Combining union bound with existance step

lemma *Union-bound-obtain*:

assumes $\text{finite } A$
assumes $(\sum a \in A. \text{prob } a) < 1$
assumes $A \subseteq \text{events}$
obtains e **where** $e \in \text{space } M$ **and** $e \notin \bigcup A$

lemma *Union-bound-obtain-fun*:

assumes $\text{finite } A$

```

assumes  $(\sum a \in A. \text{prob } (f a)) < 1$ 
assumes  $f`A \subseteq \text{events}$ 
obtains  $e$  where  $e \in \text{space } M$  and  $e \notin \bigcup (f`A)$ 
⟨proof⟩

lemma Union-bound-obtain-compl:
assumes finite  $A$ 
assumes  $(\sum a \in A. \text{prob } a) < 1$ 
assumes  $A \subseteq \text{events}$ 
obtains  $e$  where  $e \in (\text{space } M - \bigcup A)$ 
⟨proof⟩

lemma Union-bound-obtain-compl-fun:
assumes finite  $A$ 
assumes  $(\sum a \in A. \text{prob } (f a)) < 1$ 
assumes  $f`A \subseteq \text{events}$ 
obtains  $e$  where  $e \in (\text{space } M - \bigcup (f`A))$ 
⟨proof⟩

end

end

```

7 Lovasz Local Lemma

```

theory Lovasz-Local-Lemma
imports
  Basic-Method
  HOL-Real-Asymp.Real-Asymp
  Indep-Events
  Digraph-Extensions
begin

```

7.1 Random Lemmas on Product Operator

```

lemma prod-constant-ge:
fixes  $y :: 'b :: \{\text{comm-monoid-mult}, \text{linordered-semidom}\}$ 
assumes card  $A \leq k$ 
assumes  $y \geq 0$  and  $y < 1$ 
shows  $(\prod x \in A. y) \geq y^k$ 
⟨proof⟩

lemma (in linordered-idom) prod-mono3:
assumes finite  $J$   $I \subseteq J \wedge i \in J \implies 0 \leq f i \ (\wedge i. i \in J \implies f i \leq 1)$ 
shows prod  $f J \leq$  prod  $f I$ 
⟨proof⟩

lemma bij-on-ss-image:
assumes  $A \subseteq B$ 

```

```

assumes bij-betw g B B'
shows g ` A ⊆ B'
⟨proof⟩

lemma bij-on-ss-proper-image:
assumes A ⊂ B
assumes bij-betw g B B'
shows g ` A ⊂ B'
⟨proof⟩

```

7.2 Dependency Graph Concept

Uses directed graphs. The pair_digraph locale was sufficient as multi-edges are irrelevant

```

locale dependency-digraph = pair-digraph G :: nat pair-pre-digraph + prob-space
M :: 'a measure
for G M + fixes F :: nat ⇒ 'a set
assumes vss: F ` (pverts G) ⊆ events
assumes mis: ⋀ i. i ∈ (pverts G) ⇒ mutual-indep-events (F i) F ((pverts G)
– ({i} ∪ neighborhood i))
begin

lemma dep-graph-indiv-nh-indep:
assumes A ∈ pverts G B ∈ pverts G
assumes B ∉ neighborhood A
assumes A ≠ B
assumes prob (F B) ≠ 0
shows P((F A) | (F B)) = prob (F A)
⟨proof⟩

lemma mis-subset:
assumes i ∈ pverts G
assumes A ⊆ pverts G
shows mutual-indep-events (F i) F (A – ({i} ∪ neighborhood i))
⟨proof⟩

lemma dep-graph-indep-events:
assumes A ⊆ pverts G
assumes ⋀ Ai. Ai ∈ A ⇒ out-degree G Ai = 0
shows indep-events F A
⟨proof⟩

end

```

7.3 Lovasz Local General Lemma

```

context prob-space
begin

```

```

lemma compl-sets-index:
  assumes  $F`A \subseteq \text{events}$ 
  shows  $(\lambda i. \text{space } M - F i)`A \subseteq \text{events}$ 
   $\langle \text{proof} \rangle$ 

lemma lovasz-inductive-base:
  assumes dependency-digraph  $G M F$ 
  assumes  $\bigwedge Ai . Ai \in A \implies g Ai \geq 0 \wedge g Ai < 1$ 
  assumes  $\bigwedge Ai . Ai \in A \implies (\text{prob}(F Ai) \leq (g Ai) * (\prod Aj \in \text{pre-digraph.neighborhood } G Ai . (1 - (g Aj))))$ 
  assumes  $Ai \in A$ 
  assumes pverts  $G = A$ 
  shows  $\text{prob}(F Ai) \leq g Ai$ 
   $\langle \text{proof} \rangle$ 

lemma lovasz-inductive-base-set:
  assumes  $N \subseteq A$ 
  assumes  $\bigwedge Ai . Ai \in A \implies g Ai \geq 0 \wedge g Ai < 1$ 
  assumes  $\bigwedge Ai . Ai \in A \implies (\text{prob}(F Ai) \leq (g Ai) * (\prod Aj \in N . (1 - (g Aj))))$ 
  assumes  $Ai \in A$ 
  shows  $\text{prob}(F Ai) \leq g Ai$ 
   $\langle \text{proof} \rangle$ 

lemma split-prob-lt-helper:
  assumes dep-graph: dependency-digraph  $G M F$ 
  assumes dep-graph-verts: pverts  $G = A$ 
  assumes fbounds:  $\bigwedge i . i \in A \implies f i \geq 0 \wedge f i < 1$ 
  assumes prob-Ai:  $\bigwedge Ai . Ai \in A \implies \text{prob}(F Ai) \leq (f Ai) * (\prod Aj \in \text{pre-digraph.neighborhood } G Ai . (1 - (f Aj)))$ 
  assumes aiin:  $Ai \in A$ 
  assumes  $N \subseteq \text{pre-digraph.neighborhood } G Ai$ 
  assumes  $\exists P1 P2. \mathcal{P}(F Ai | \bigcap Aj \in S. \text{space } M - F Aj) = P1/P2 \wedge P1 \leq \text{prob}(F Ai) \wedge P2 \geq (\prod Aj \in N . (1 - (f Aj)))$ 
  shows  $\mathcal{P}(F Ai | \bigcap Aj \in S. \text{space } M - F Aj) \leq f Ai$ 
   $\langle \text{proof} \rangle$ 

lemma lovasz-inequality:
  assumes finS: finite  $S$ 
  assumes sevents:  $F`S \subseteq \text{events}$ 
  assumes S-subset:  $S \subseteq A - \{Ai\}$ 
  assumes prob2:  $\text{prob}(\bigcap Aj \in S . (\text{space } M - (F Aj))) > 0$ 
  assumes irange:  $i \in \{0..<\text{card } S1\}$ 
  assumes bb: bij-betw  $\{0..<\text{card } S1\} S1$ 
  assumes s1-def:  $S1 = (S \cap N)$ 
  assumes s2-def:  $S2 = S - S1$ 
  assumes ne-cond:  $i > 0 \vee S2 \neq \{\}$ 
  assumes hyps:  $\bigwedge B. B \subset S \implies g i \in A \implies B \subseteq A - \{g i\} \implies B \neq \{\} \implies 0 < \text{prob}(\bigcap Aj \in B . \text{space } M - F Aj) \implies \mathcal{P}(F(g i) | \bigcap Aj \in B . \text{space } M - F Aj) \leq f(g i)$ 

```

shows $\mathcal{P}((\text{space } M - F(g i)) \mid (\bigcap ((\lambda i. \text{space } M - F i) \cdot g \cdot \{0..<i\}) \cup ((\lambda i. \text{space } M - F i) \cdot S2)))$
 $\geq (1 - f(g i))$
 $\langle \text{proof} \rangle$

The main helper lemma

lemma *lovasz-inductive*:

assumes finA : finite A
assumes $A\text{events}$: $F \cdot A \subseteq \text{events}$
assumes $f\text{bounds}$: $\bigwedge i. i \in A \implies f i \geq 0 \wedge f i < 1$
assumes dep-graph : dependency-digraph $G M F$
assumes dep-graph-verts : $\text{pverts } G = A$
assumes prob-Ai : $\bigwedge Ai. Ai \in A \implies \text{prob}(F Ai) \leq (f Ai) * (\prod Aj \in \text{pre-digraph.neighborhood } G Ai. (1 - (f Aj)))$
assumes $Ai\text{-in}$: $Ai \in A$
assumes $S\text{-subset}$: $S \subseteq A - \{Ai\}$
assumes $S\text{-nonempty}$: $S \neq \{\}$
assumes prob2 : $\text{prob}(\bigcap Aj \in S. (\text{space } M - (F Aj))) > 0$
shows $\mathcal{P}((F Ai) \mid (\bigcap Aj \in S. (\text{space } M - (F Aj)))) \leq f Ai$
 $\langle \text{proof} \rangle$

The main lemma

theorem *lovasz-local-general*:

assumes $A \neq \{\}$
assumes $F \cdot A \subseteq \text{events}$
assumes $\text{finite } A$
assumes $\bigwedge Ai. Ai \in A \implies f Ai \geq 0 \wedge f Ai < 1$
assumes $\text{dependency-digraph } G M F$
assumes $\bigwedge Ai. Ai \in A \implies (\text{prob}(F Ai) \leq (f Ai) * (\prod Aj \in \text{pre-digraph.neighborhood } G Ai. (1 - (f Aj))))$
assumes $\text{pverts } G = A$
shows $\text{prob}(\bigcap Ai \in A. (\text{space } M - (F Ai))) \geq (\prod Ai \in A. (1 - f Ai)) (\prod Ai \in A. (1 - f Ai)) > 0$
 $\langle \text{proof} \rangle$

7.4 Lovasz Corollaries and Variations

corollary *lovasz-local-general-positive*:

assumes $A \neq \{\}$
assumes $F \cdot A \subseteq \text{events}$
assumes $\text{finite } A$
assumes $\bigwedge Ai. Ai \in A \implies f Ai \geq 0 \wedge f Ai < 1$
assumes $\text{dependency-digraph } G M F$
assumes $\bigwedge Ai. Ai \in A \implies (\text{prob}(F Ai) \leq (f Ai) * (\prod Aj \in \text{pre-digraph.neighborhood } G Ai. (1 - (f Aj))))$
assumes $\text{pverts } G = A$
shows $\text{prob}(\bigcap Ai \in A. (\text{space } M - (F Ai))) > 0$
 $\langle \text{proof} \rangle$

```

theorem lovasz-local-symmetric-dep-graph:
  fixes e :: real
  fixes d :: nat
  assumes A ≠ {}
  assumes F ` A ⊆ events
  assumes finite A
  assumes dependency-digraph G M F
  assumes ⋀ Ai. Ai ∈ A ⇒ out-degree G Ai ≤ d
  assumes ⋀ Ai. Ai ∈ A ⇒ prob (F Ai) ≤ p
  assumes exp(1)* p * (d + 1) ≤ 1
  assumes pverts G = A
  shows prob (∩ Ai ∈ A . (space M – (F Ai))) > 0
⟨proof⟩

```

```

corollary lovasz-local-symmetric4gt:
  fixes e :: real
  fixes d :: nat
  assumes A ≠ {}
  assumes F ` A ⊆ events
  assumes finite A
  assumes dependency-digraph G M F
  assumes ⋀ Ai. Ai ∈ A ⇒ out-degree G Ai ≤ d
  assumes ⋀ Ai. Ai ∈ A ⇒ prob (F Ai) ≤ p
  assumes 4 * p * d ≤ 1
  assumes d ≥ 3
  assumes pverts G = A
  shows prob (∩ Ai ∈ A . (space M – F Ai)) > 0
⟨proof⟩

```

```

lemma lovasz-local-symmetric4:
  fixes e :: real
  fixes d :: nat
  assumes A ≠ {}
  assumes F ` A ⊆ events
  assumes finite A
  assumes dependency-digraph G M F
  assumes ⋀ Ai. Ai ∈ A ⇒ out-degree G Ai ≤ d
  assumes ⋀ Ai. Ai ∈ A ⇒ prob (F Ai) ≤ p
  assumes 4 * p * d ≤ 1
  assumes d ≥ 1
  assumes pverts G = A
  shows prob (∩ Ai ∈ A . (space M – F Ai)) > 0
⟨proof⟩

```

Converting between dependency graph and indexed set representation of mutual independence

```

lemma (in pair-digraph) g-Ai-simplification:
  assumes Ai ∈ A

```

```

assumes  $g Ai \subseteq A - \{Ai\}$ 
assumes  $pverts G = A$ 
assumes  $parcs G = \{e \in A \times A . snd e \in (A - (\{fst e\} \cup (g (fst e))))\}$ 
shows  $g Ai = A - (\{Ai\} \cup neighborhood Ai)$ 
⟨proof⟩

lemma define-dep-graph-set:
assumes  $A \neq \{\}$ 
assumes  $F ` A \subseteq events$ 
assumes finite A
assumes  $\bigwedge Ai. Ai \in A \implies g Ai \subseteq A - \{Ai\} \wedge mutual-indep-events (F Ai) F (g Ai)$ 
shows dependency-digraph (⟨ $pverts = A$ ,  $parcs = \{e \in A \times A . snd e \in (A - (\{fst e\} \cup (g (fst e))))\}$ ⟩)  $M F$ 
    (is dependency-digraph ?G M F)
⟨proof⟩

lemma define-dep-graph-deg-bound:
assumes  $A \neq \{\}$ 
assumes  $F ` A \subseteq events$ 
assumes finite A
assumes  $\bigwedge Ai. Ai \in A \implies g Ai \subseteq A - \{Ai\} \wedge card (g Ai) \geq card A - d - 1$ 
 $\wedge$ 
    mutual-indep-events (F Ai) F (g Ai)
shows  $\bigwedge Ai. Ai \in A \implies$ 
    out-degree (⟨ $pverts = A$ ,  $parcs = \{e \in A \times A . snd e \in (A - (\{fst e\} \cup (g (fst e))))\}$ ⟩) Ai ≤ d
    (is  $\bigwedge Ai. Ai \in A \implies$  out-degree (with-proj ?G) Ai ≤ d)
⟨proof⟩

lemma obtain-dependency-graph:
assumes  $A \neq \{\}$ 
assumes  $F ` A \subseteq events$ 
assumes finite A
assumes  $\bigwedge Ai. Ai \in A \implies$ 
    ( $\exists S . S \subseteq A - \{Ai\} \wedge card S \geq card A - d - 1 \wedge mutual-indep-events (F Ai) F S$ )
obtains  $G$  where dependency-digraph G M F pverts G = A  $\wedge$   $\bigwedge Ai. Ai \in A \implies$ 
out-degree G Ai ≤ d
⟨proof⟩

```

This is the variation of the symmetric version most commonly in use

```

theorem lovasz-local-symmetric:
fixes  $d :: nat$ 
assumes  $A \neq \{\}$ 
assumes  $F ` A \subseteq events$ 
assumes finite A
assumes  $\bigwedge Ai. Ai \in A \implies (\exists S . S \subseteq A - \{Ai\} \wedge card S \geq card A - d - 1$ 
 $\wedge mutual-indep-events (F Ai) F S)$ 

```

```

assumes  $\bigwedge Ai. Ai \in A \implies \text{prob}(F Ai) \leq p$ 
assumes  $\exp(1)*p * (d + 1) \leq 1$ 
shows  $\text{prob}(\bigcap Ai \in A . (\text{space } M - (F Ai))) > 0$ 
⟨proof⟩

lemma lovasz-local-symmetric4-set:
  fixes d :: nat
  assumes A ≠ {}
  assumes F ` A ⊆ events
  assumes finite A
  assumes  $\bigwedge Ai. Ai \in A \implies (\exists S. S \subseteq A - \{Ai\} \wedge \text{card } S \geq \text{card } A - d - 1$ 
  ∧ mutual-indep-events (F Ai) F S)
  assumes  $\bigwedge Ai. Ai \in A \implies \text{prob}(F Ai) \leq p$ 
  assumes  $4 * p * d \leq 1$ 
  assumes d ≥ 1
  shows  $\text{prob}(\bigcap Ai \in A . (\text{space } M - F Ai)) > 0$ 
⟨proof⟩
end

end
theory Lovasz-Local-Root
imports
  PiE-Rel-Extras
  Digraph-Extensions
  Prob-Events-Extras
  Cond-Prob-Extensions
  Indep-Events
  Basic-Method
  Lovasz-Local-Lemma
begin
end

```

References

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