

Gale-Shapley Algorithm

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Abstract

This is a stepwise refinement and proof of the Gale-Shapley stable matching (or marriage) algorithm down to executable code. Both a purely functional implementation based on lists and a functional implementation based on efficient arrays (provided by the Collections entry in the AFP) are developed. The latter implementation runs in time $O(n^2)$ where n is the cardinality of the two sets to be matched.

1 Introduction

The Gale-Shapley algorithm [3, 4] for stable matchings (or marriages) matches two sets of the same cardinality n , where each element has a complete list of preferences (a linear order) of the elements of the other set.

The refinement process is carried out largely on the level of a simple imperative language. In every refinement step the whole algorithm is stated and proved. Most of the proof is abstracted into general lemmas that are used in multiple proofs. Except for one bigger step, each algorithm proof is obtained from the previous one by incremental changes. In the end, two executable functional algorithms are obtained: a purely functional one based on lists and a functional one based on a persistent imperative implementation of arrays (provided by the AFP entry Collections Framework [5] based on [1] (see also [2])). The latter algorithm has linear complexity, i.e. $O(n^2)$.

We prove that each of the algorithm computes a stable matching that is optimal for one of the two sets.

2 Part 1: Refinement down to lists

```

theory Gale-Shapley1
imports
  HOL-Hoare.Hoare-Logic
  List-Index.List-Index
  HOL-Library.While-Combinator
  HOL-Library.LaTeXsugar
begin

2.1 Misc

lemmas conj12 = conjunct1 conjunct2

syntax
  -assign-list :: idt ⇒ nat ⇒ 'b ⇒ 'com ((2-[-] :=/ -) [70, 0, 65] 61)

syntax-consts
  -assign-list ⇌ list-update

translations
  xs[n] := e → xs := CONST list-update xs n e

abbreviation upt-set :: nat ⇒ nat set (({<-}) where
  {<n} ≡ {0..<n}

definition prefers :: 'a list ⇒ 'a ⇒ 'a ⇒ bool where
  prefers P x y = (index P x < index P y)

abbreviation pref-a :: 'a list ⇒ 'a ⇒ 'a ⇒ bool ((- ⊢/ - < -) [50,50,50] 50)
where
  P ⊢ x < y ≡ prefers P x y

lemma prefers-asym: P ⊢ x < y ==> ¬ P ⊢ y < x
  ⟨proof⟩

lemma prefers-trans: P ⊢ x < y ==> P ⊢ y < z ==> P ⊢ x < z
  ⟨proof⟩

fun rk-of-pref :: nat ⇒ nat list ⇒ nat list ⇒ nat list where
  rk-of-pref r rs (n#ns) = (rk-of-pref (r+1) rs ns)[n := r] |
  rk-of-pref r rs [] = rs

definition ranking :: nat list ⇒ nat list where
  ranking P = rk-of-pref 0 (replicate (length P) 0) P

lemma length-rk-of-pref[simp]: length(rk-of-pref v vs P) = length vs
  ⟨proof⟩

```

```

lemma nth-rk-of-pref:  $\llbracket \text{length } P \leq \text{length } rs; i \in \text{set } P; \text{distinct } P; \text{set } P \subseteq \{<\text{length } rs\} \rrbracket$   

 $\implies \text{rk-of-pref } r \text{ } rs \text{ } P ! i = \text{index } P \text{ } i + r$   

 $\langle \text{proof} \rangle$ 

lemma ranking-index:  $\llbracket \text{length } P = n; \text{set } P = \{<n\} \rrbracket \implies \text{ranking } P = \text{map}(\text{index } P) [0..\text{length } P]$   

 $\langle \text{proof} \rangle$ 

lemma ranking-iff-pref:  $\llbracket \text{set } P = \{<\text{length } P\}; i < \text{length } P; j < \text{length } P \rrbracket$   

 $\implies \text{ranking } P ! i < \text{ranking } P ! j \longleftrightarrow P \vdash i < j$   

 $\langle \text{proof} \rangle$ 

```

2.2 Fixing the preference lists

type-synonym $\text{prefs} = \text{nat list list}$

```

locale  $\text{Pref} =$   

fixes  $n$   

fixes  $P :: \text{prefs}$   

fixes  $Q :: \text{prefs}$   

defines  $n \equiv \text{length } P$   

assumes  $\text{length-}Q: \text{length } Q = n$   

assumes  $P\text{-set}: a < n \implies \text{length}(P!a) = n \wedge \text{set}(P!a) = \{<n\}$   

assumes  $Q\text{-set}: b < n \implies \text{length}(Q!b) = n \wedge \text{set}(Q!b) = \{<n\}$   

begin

```

abbreviation $\text{wf} :: \text{nat list} \Rightarrow \text{bool}$ **where**
 $\text{wf } xs \equiv \text{length } xs = n \wedge \text{set } xs \subseteq \{<n\}$

lemma wf-less-n: $\llbracket \text{wf } A; a < n \rrbracket \implies A!a < n$
 $\langle \text{proof} \rangle$

corollary wf-le-n1: $\llbracket \text{wf } A; a < n \rrbracket \implies A!a \leq n-1$
 $\langle \text{proof} \rangle$

lemma sumA-ub: $\text{wf } A \implies (\sum a < n. A!a) \leq n*(n-1)$
 $\langle \text{proof} \rangle$

2.3 The (termination) variant(s)

Basic idea: either some $A!a$ is incremented or size of M is incremented, but this cannot go on forever because in the worst case all $A!a = n-1$ and $M = n$. Because $n*(n-1) + n = n^2$, this leads to the following simple variant:

definition $\text{var0} :: \text{nat list} \Rightarrow \text{nat set} \Rightarrow \text{nat}$ **where**
 $[\text{simp}]: \text{var0 } A \text{ } M = (n^2 - ((\sum a < n. A!a) + \text{card } M))$

lemma var0-match:

assumes $wf A M \subseteq \{<n\}$ $a < n \wedge a \notin M$

shows $var0 A (M \cup \{a\}) < var0 A M$

$\langle proof \rangle$

lemma $var0\text{-next}:$

assumes $wf A M \subseteq \{<n\}$ $M \neq \{<n\}$ $a' < n$

shows $var0 (A[a' := A ! a' + 1]) M < var0 A M$

$\langle proof \rangle$

definition $var :: nat list \Rightarrow nat set \Rightarrow nat$ **where**

[simp]: $var A M = (n^2 - n + 1 - (\sum a < n. A!a) + card M)$

lemma $sumA\text{-ub2}:$

assumes $a' < n$ $A!a' \leq n-1 \forall a < n. a \neq a' \rightarrow A!a \leq n-2$

shows $(\sum a < n. A!a) \leq (n-1)*(n-1)$

$\langle proof \rangle$

definition $match A a = P ! a ! (A ! a)$

lemma $match\text{-less-}n: \llbracket wf A; a < n \rrbracket \implies match A a < n$

$\langle proof \rangle$

lemma $match\text{-upd-neq}: \llbracket wf A; a < n; a \neq a' \rrbracket \implies match (A[a := b]) a' = match$

$A a'$

$\langle proof \rangle$

definition $stable :: nat list \Rightarrow nat set \Rightarrow bool$ **where**

$stable A M = (\neg(\exists a \in M. \exists a' \in M. P ! a \vdash match A a' < match A a \wedge Q ! match A a' \vdash a < a'))$

The set of Bs that an A would prefer to its current match, i.e. all Bs above its current match $A!a$.

abbreviation $preferred$ **where**

$preferred A a == nth (P!a) ` \{< A!a\}$

definition $matching$ **where** [simp]:

$matching A M = (wf A \wedge inj-on (match A) M)$

If a' is unmatched and final then all other a are matched:

lemma $final\text{-last}:$

assumes $M: M \subseteq \{<n\}$ **and** $inj: inj-on (match A) M$ **and** $pref-match': preferred A a \subseteq match A ` M$

and $a: a < n \wedge a \notin M$ **and** $final: A ! a + 1 = n$

shows $insert a M = \{<n\}$

$\langle proof \rangle$

lemma $more\text{-choices}:$

assumes $A: wf A$ **and** $M: M \subseteq \{<n\}$ $M \neq \{<n\}$

and $pref-match': preferred A a \subseteq match A ` M$

and $a < n$ **and** *matched*: $\text{match } A \ a \in \text{match } A`M$

shows $A!a + 1 < n$

(proof)

corollary *more-choices-matched*:

assumes $\text{wf } A \ M \subseteq \{<n\} \ M \neq \{<n\}$

and $\text{preferred } A \ a \subseteq \text{match } A`M$ **and** $a \in M$

shows $A!a + 1 < n$

(proof)

lemma *almost1-final*: **assumes** $M: M \subseteq \{<n\}$ **and** *inj-on* ($\text{match } A$) M

and $\forall a < n. \ \text{preferred } A \ a \subseteq \text{match } A`M$

shows $\exists_{\leq 1} a. \ a < n \wedge a \notin M \wedge A!a + 1 = n$

(proof)

lemma *sumA-UB*:

assumes $\text{matching } A \ M \ M \subseteq \{<n\} \ M \neq \{<n\} \ \forall a < n. \ \text{preferred } A \ a \subseteq \text{match } A`M$

shows $(\sum a < n. A!a) \leq (n-1)^2$

(proof)

lemma *var-ub*:

assumes $\text{matching } A \ M \ M \subseteq \{<n\} \ M \neq \{<n\} \ \forall a < n. \ \text{preferred } A \ a \subseteq \text{match } A`M$

shows $(\sum a < n. A!a) + \text{card } M < n^2 - n + 1$

(proof)

lemma *var-match*:

assumes $\text{matching } A \ M \ M \subseteq \{<n\} \ M \neq \{<n\} \ \forall a < n. \ \text{preferred } A \ a \subseteq \text{match } A`M$

shows $\text{var } A(M \cup \{a\}) < \text{var } A \ M$

(proof)

lemma *var-next*:

assumes $\text{matching } A \ M \ M \subseteq \{<n\} \ M \neq \{<n\} \ \forall a < n. \ \text{preferred } A \ a \subseteq \text{match } A`M$

$a < n$

shows $\text{var } (A[a := A!a + 1]) \ M < \text{var } A \ M$

(proof)

2.4 Auxiliary Predicates

The following two predicates express the same property: if a prefers b over a 's current match, then b is matched with an a' that b prefers to a .

definition *pref-match* **where**

$\text{pref-match } A \ M = (\forall a < n. \ \forall b < n. \ P!a \vdash b < \text{match } A \ a \longrightarrow (\exists a' \in M. \ b = \text{match } A \ a' \wedge Q!b \vdash a' < a))$

definition *pref-match'* **where**

pref-match' A $M = (\forall a < n. \forall b \in \text{preferred } A \ a. \exists a' \in M. b = \text{match } A \ a' \wedge Q ! b \vdash a' < a)$

lemma *pref-match'-iff*: $\text{wf } A \implies \text{pref-match}' A \ M = \text{pref-match } A \ M$
 $\langle \text{proof} \rangle$

definition *optiA* **where**

optiA $A = (\nexists A'. \text{matching } A' \{<n\} \wedge \text{stable } A' \{<n\} \wedge (\exists a < n. P ! a \vdash \text{match } A' a < \text{match } A \ a))$

definition *pessiB* **where**

pessiB $A = (\nexists A'. \text{matching } A' \{<n\} \wedge \text{stable } A' \{<n\} \wedge (\exists a < n. \exists a' < n. \text{match } A \ a = \text{match } A' a' \wedge Q ! \text{match } A \ a \vdash a < a'))$

lemma *optiA-pessiB*: **assumes** *optiA* A **shows** *pessiB* A
 $\langle \text{proof} \rangle$

lemma *optiA-inv*:

assumes $A: \text{wf } A$ **and** $a: a < n$ **and** $a': a' < n$ **and** *same-match*: $\text{match } A \ a' = \text{match } A \ a$
and *pref*: $Q ! \text{match } A \ a' \vdash a' < a$ **and** *optiA* A
shows *optiA* ($A[a := A ! a + 1]$)
 $\langle \text{proof} \rangle$

lemma *pref-match-stable*:

$\llbracket \text{matching } A \ {<n}; \text{pref-match } A \ {<n} \rrbracket \implies \text{stable } A \ {<n}$
 $\langle \text{proof} \rangle$

2.5 Algorithm 1

definition *invAM* **where**

[simp]: *invAM* $A \ M = (\text{matching } A \ M \wedge M \subseteq \{<n\} \wedge \text{pref-match } A \ M \wedge \text{optiA } A)$

lemma *invAM-match*:

$\llbracket \text{invAM } A \ M; \ a < n \wedge a \notin M; \ \text{match } A \ a \notin \text{match } A \ ` M \rrbracket \implies \text{invAM } A \ (M \cup \{a\})$
 $\langle \text{proof} \rangle$

lemma *invAM-swap*:

assumes *invAM* $A \ M$
assumes $a: a < n \wedge a \notin M$ **and** $a': a' \in M \wedge \text{match } A \ a' = \text{match } A \ a$ **and** *pref*:
 $Q ! \text{match } A \ a' \vdash a < a'$
shows *invAM* ($A[a' := A ! a' + 1]$) ($M - \{a'\} \cup \{a\}$)
 $\langle \text{proof} \rangle$

lemma *preferred-subset-match-if-invAM*:

```

assumes invAM A M
shows  $\forall a < n. \text{preferred } A a \subseteq \text{match } A ` M (\text{is } ?P)$ 
(proof)

lemma invAM-next:
assumes invAM A M
assumes  $a: a < n \wedge a \notin M \text{ and } a': a' \in M \wedge \text{match } A a' = \text{match } A a \text{ and pref:}$ 
 $\neg Q ! \text{match } A a' \vdash a < a'$ 
shows invAM (A[a := A!a + 1]) M
(proof)

```

```

lemma Gale-Shapley1: VARS M A a a' b
[M = {} \wedge A = replicate n 0]
WHILE M \neq {} < n
INV { invAM A M }
VAR {var A M}
DO a := (SOME a. a < n \wedge a \notin M); b := match A a;
IF b \notin match A ` M
THEN M := M \cup {a}
ELSE a' := (SOME a'. a' \in M \wedge \text{match } A a' = b);
IF Q ! \text{match } A a' \vdash a < a'
THEN A[a'] := A!a'+1; M := M - {a'} \cup {a}
ELSE A[a] := A!a+1
FI
FI
OD
[matching A {} < n \wedge stable A {} < n \wedge optiA A]
(proof)

```

Proof also works for *var0* instead of *var*.

2.6 Algorithm 2: List of unmatched As

```

abbreviation invas where
invas as == (set as \subseteq {} < n \wedge distinct as)

```

```

lemma Gale-Shapley2: VARS A a a' as b
[as = [0..<n] \wedge A = replicate n 0]
WHILE as \neq []
INV { invAM A ({} < n) - set as \wedge invas as }
VAR {var A ({} < n) - set as}
DO a := hd as; b := match A a;
IF b \notin match A ` ({} < n) - set as
THEN as := tl as
ELSE a' := (SOME a'. a' \in {} < n - set as \wedge \text{match } A a' = b);
IF Q ! \text{match } A a' \vdash a < a'
THEN A[a'] := A!a'+1; as := a' \# tl as
ELSE A[a] := A!a+1
FI

```

FI
 OD
 $[matching\ A\ \{<n\} \wedge stable\ A\ \{<n\} \wedge optiA\ A]$
 $\langle proof \rangle$

2.7 Algorithm 3: Record matching of Bs to As

abbreviation $invAB :: nat\ list \Rightarrow (nat \Rightarrow nat\ option) \Rightarrow nat\ set \Rightarrow bool$ **where**
 $invAB\ A\ B\ M == (ran\ B = M \wedge (\forall b\ a. B\ b = Some\ a \longrightarrow match\ A\ a = b))$

lemma $invAB\text{-swap}:$
assumes $invAB: invAB\ A\ B\ M$
assumes $a: a < n \wedge a \notin M$ **and** $a': a' \in M \wedge match\ A\ a' = match\ A\ a$
and $inj\text{-on } B\ (dom\ B)\ B(match\ A\ a) = Some\ a'$
shows $invAB\ (A[a' := A!a'+1])\ (B(match\ A\ a := Some\ a))\ (M - \{a'\} \cup \{a\})$
 $\langle proof \rangle$

lemma $Gale\text{-Shapley3}: VARS\ A\ B\ a\ a'\ as\ b$
 $[as = [0..<n] \wedge A = replicate\ n\ 0 \wedge B = (\lambda_. None)]$
 $WHILE\ as \neq []$
 $INV\ \{invAM\ A\ (\{<n\} - set\ as) \wedge invAB\ A\ B\ (\{<n\} - set\ as) \wedge invas\ as\}$
 $VAR\ \{var\ A\ (\{<n\} - set\ as)\}$
 $DO\ a := hd\ as; b := match\ A\ a;$
 $IF\ B\ b = None$
 $THEN\ B := B(b := Some\ a); as := tl\ as$
 $ELSE\ a' := the(B\ b);$
 $IF\ Q ! match\ A\ a' \vdash a < a'$
 $THEN\ B := B(b := Some\ a); A[a'] := A!a'+1; as := a' \# tl\ as$
 $ELSE\ A[a] := A!a+1$
 FI
 FI
 OD
 $[matching\ A\ \{<n\} \wedge stable\ A\ \{<n\} \wedge optiA\ A]$
 $\langle proof \rangle$

2.8 Unused data refinement step

abbreviation $invAB' :: nat\ list \Rightarrow nat\ list \Rightarrow bool\ list \Rightarrow nat\ set \Rightarrow bool$ **where**
 $invAB'\ A\ B\ M\ M' == (length\ B = n \wedge length\ M = n \wedge M' = nth\ B\ ' \{b. b < n \wedge M!b\})$
 $\wedge (\forall b < n. M!b \longrightarrow B!b < n \wedge match\ A\ (B!b) = b))$

lemma $Gale\text{-Shapley4-unused}: VARS\ A\ B\ M\ a\ a'\ as\ b$
 $[as = [0..<n] \wedge A = replicate\ n\ 0 \wedge B = replicate\ n\ 0 \wedge M = replicate\ n\ False]$
 $WHILE\ as \neq []$
 $INV\ \{invAM\ A\ (\{<n\} - set\ as) \wedge invAB'\ A\ B\ M\ (\{<n\} - set\ as) \wedge invas\ as\}$
 $VAR\ \{var\ A\ (\{<n\} - set\ as)\}$
 $DO\ a := hd\ as; b := match\ A\ a;$
 $IF\ \neg(M ! b)$

```

THEN  $M[b] := \text{True}$ ;  $B[b] := a$ ;  $as := tl\ as$ 
ELSE  $a' := B ! b$ ;
    IF  $Q ! \text{match } A\ a' \vdash a < a'$ 
        THEN  $B[b] := a$ ;  $A[a'] := A!a'+1$ ;  $as := a' \# tl\ as$ 
        ELSE  $A[a] := A!a+1$ 
    FI
FI
OD
[ $\text{wf } A \wedge \text{inj-on } (\text{match } A) \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A$ ]
⟨proof⟩

```

2.9 Algorithm 4: remove list of unmatched As

2.9.1 An initial version

The inner variant appears intuitive but complicates the derivation of an overall complexity bound because the inner variant also depends on a variable that is modified by the outer loop.

```

lemma Gale-Shapley4:
VARS  $A\ B\ ai\ a\ a'$ 
 $[ai = 0 \wedge A = \text{replicate } n\ 0 \wedge B = (\lambda\_. \text{None})]$ 
WHILE  $ai < n$ 
INV {  $\text{invAM } A \{<ai\} \wedge \text{invAB } A\ B \{<ai\} \wedge ai \leq n$  }
VAR {  $z = n - ai$  }
DO  $a := ai$ ;
    WHILE  $B(\text{match } A\ a) \neq \text{None}$ 
    INV {  $\text{invAM } A(\{<ai+1\} - \{a\}) \wedge \text{invAB } A\ B(\{<ai+1\} - \{a\}) \wedge (a \leq ai$ 
 $\wedge ai < n) \wedge z = n - ai$  }
    VAR {  $\text{var } A \{<ai\}$  }
    DO  $a' := \text{the}(B(\text{match } A\ a))$ ;
        IF  $Q ! \text{match } A\ a' \vdash a < a'$ 
            THEN  $B := B(\text{match } A\ a := \text{Some } a)$ ;  $A[a'] := A!a'+1$ ;  $a := a'$ 
            ELSE  $A[a] := A!a+1$ 
        FI
    OD;
     $B := B(\text{match } A\ a := \text{Some } a)$ ;  $ai := ai + 1$ 
OD
[ $\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A$ ]
⟨proof⟩

```

2.9.2 A better inner variant

This is the definitive version of Algorithm 4. The inner variant is changed to support the easy derivation of the precise upper bound of the number of executed actions. This variant shows that the algorithm can at most execute $n^2 - n + 1$ basic actions (match, swap, next).

```

definition  $\text{var2} :: \text{nat list} \Rightarrow \text{nat}$  where
[simp]:  $\text{var2 } A = (n-1)^{\wedge} 2 - (\sum a < n. A!a)$ 

```

Because A is not changed by the outer loop, the initial value of $\text{var2 } A$, which is $(n - 1)^2$, is an upper bound of the number of iterations of the inner loop. To this we need to add n because the outer loop executes additional n match actions at the end of the loop body. Thus at most $(n - 1)^2 + n = n^2 - n + 1$ actions are executed, exactly as in the earlier algorithms.

lemma *var2-next*:

assumes $\text{invAM } (A[a := A!a + 1]) M M \neq \{\langle n \rangle\} a < n$

shows $\text{var2 } (A[a := A!a + 1]) < \text{var2 } A$

$\langle \text{proof} \rangle$

lemma *Gale-Shapley4-var2*:

VARS A B ai a a'

$[ai = 0 \wedge A = \text{replicate } n 0 \wedge B = (\lambda_. \text{None})]$

WHILE ai < n

$\text{INV } \{ \text{invAM } A \{<ai\} \wedge \text{invAB } A B \{<ai\} \wedge ai \leq n \}$

VAR {z = n - ai}

DO a := ai;

WHILE B (match A a) ≠ None

$\text{INV } \{ \text{invAM } A (\{<ai+1\} - \{a\}) \wedge \text{invAB } A B (\{<ai+1\} - \{a\}) \wedge (a \leq ai \wedge ai < n) \wedge z = n - ai \}$

VAR {var2 A}

DO a' := the(B (match A a));

IF Q ! match A a' ⊢ a < a'

THEN B := B(match A a := Some a); A[a'] := A!a'+1; a := a'

ELSE A[a] := A!a+1

FI

OD;

B := B(match A a := Some a); ai := ai+1

OD

$[\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A]$

$\langle \text{proof} \rangle$

2.9.3 Algorithm 4.1: single-loop variant

A bit of a relic because it is an instance of a general program transformation for merging nested loops by an additional test inside the single loop.

lemma *Gale-Shapley4-1: VARS A B a a' ai b*

$[ai = 0 \wedge a = 0 \wedge A = \text{replicate } n 0 \wedge B = (\lambda_. \text{None})]$

WHILE ai < n

$\text{INV } \{ \text{invAM } A (\{<ai+1\} - \{a\}) \wedge \text{invAB } A B (\{<ai+1\} - \{a\}) \wedge (a \leq ai \wedge ai \leq n) \wedge (ai = n \longrightarrow a = ai)\}$

VAR {var A (\{<ai+1\} - \{a\})}

DO b := match A a;

IF B b = None

THEN B := B(b := Some a); ai := ai + 1; a := ai

ELSE a' := the(B b);

IF Q ! match A a' ⊢ a < a'

THEN B := B(b := Some a); A[a'] := A!a'+1; a := a'

```

ELSE A[a] := A!a+1
FI
FI
OD
[matching A {<n}  $\wedge$  stable A {<n}  $\wedge$  optiA A]
⟨proof⟩

```

2.10 Algorithm 5: Data refinement of B

definition $\alpha B N = (\lambda b. \text{if } b < n \wedge N!b \text{ then } \text{Some}(B!b) \text{ else } \text{None})$

lemma $\alpha\text{-Some}[simp]: \alpha B N b = \text{Some } a \longleftrightarrow b < n \wedge N!b \wedge a = B!b$
 $\langle proof \rangle$

lemma $\alpha update1: [\neg N ! b; b < \text{length } B; b < \text{length } N; n = \text{length } N]$
 $\implies \text{ran}(\alpha(B[b := a])(N[b := \text{True}])) = \text{ran}(\alpha B N) \cup \{a\}$
 $\langle proof \rangle$

lemma $\alpha update2: [N!b; b < \text{length } B; b < \text{length } N; \text{length } N = n]$
 $\implies \alpha(B[b := a]) N = (\alpha B N)(b := \text{Some } a)$
 $\langle proof \rangle$

abbreviation $invAB2 :: \text{nat list} \Rightarrow \text{nat list} \Rightarrow \text{bool list} \Rightarrow \text{nat set} \Rightarrow \text{bool where}$
 $invAB2 A B N M == (\text{invAB } A (\alpha B N) M \wedge (\text{length } B = n \wedge \text{length } N = n))$

definition $invar1$ **where**

[$simp$]: $invar1 A B N ai = (\text{invAM } A \{<ai\} \wedge \text{invAB2 } A B N \{<ai\} \wedge ai \leq n)$

definition $invar2$ **where**

[$simp$]: $invar2 A B N ai a \equiv (\text{invAM } A (\{<ai+1\} - \{a\}) \wedge \text{invAB2 } A B N (\{<ai+1\} - \{a\}) \wedge a \leq ai \wedge ai < n)$

First, the ‘old’ version with the more complicated inner variant:

lemma $Gale-Shapley5:$
 $VARS A B N ai a a'$
 $[ai = 0 \wedge A = \text{replicate } n 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \text{ False}]$
 $WHILE ai < n$
 $INV \{ invar1 A B N ai \}$
 $VAR \{ z = n - ai \}$
 $DO a := ai;$
 $WHILE N ! match A a$
 $INV \{ invar2 A B N ai a \wedge z = n - ai \}$
 $VAR \{ var A \{<ai\} \}$
 $DO a' := B ! match A a;$
 $IF Q ! match A a' \vdash a < a'$
 $THEN B[match A a] := a; A[a'] := A!a'+1; a := a'$
 $ELSE A[a] := A!a+1$
 FI
 $OD;$

$B[\text{match } A \ a] := a$; $N[\text{match } A \ a] := \text{True}$; $ai := ai + 1$
OD
 $[\text{matching } A \ \{<n\} \wedge \text{stable } A \ \{<n\} \wedge \text{optiA } A]$
 $\langle \text{proof} \rangle$

The definitive version with variant *var2*:

lemma *Gale-Shapley5-var2*:
VARS A B N ai a a'
 $[ai = 0 \wedge A = \text{replicate } n \ 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \ \text{False}]$
WHILE ai < n
INV { invar1 A B N ai }
VAR { z = n - ai }
DO a := ai;
WHILE N ! match A a
INV { invar2 A B N ai a \wedge z = n - ai }
VAR { var2 A }
DO a' := B ! match A a;
IF Q ! match A a' \vdash a < a'
THEN $B[\text{match } A \ a] := a$; $A[a'] := A[a'] + 1$; $a := a'$
ELSE $A[a] := A[a] + 1$
FI
OD;
 $B[\text{match } A \ a] := a$; $N[\text{match } A \ a] := \text{True}$; $ai := ai + 1$
OD
 $[\text{matching } A \ \{<n\} \wedge \text{stable } A \ \{<n\} \wedge \text{optiA } A]$
 $\langle \text{proof} \rangle$

2.10.1 Algorithm 5.1: single-loop variant

definition *invar2'* **where**
 $[\text{simp}]: \text{invar2}' A B N ai a \equiv (\text{invAM } A (\{<ai+1\} - \{a\}) \wedge \text{invAB2 } A B N (\{<ai+1\} - \{a\}) \wedge a \leq ai \wedge ai \leq n)$
lemma *pres2'*:
assumes $\text{invar2}' A B N ai a \wedge ai < n \wedge \text{var } A (\{<ai + 1\} - \{a\}) = v$
and after $[\text{simp}]$: $b = \text{match } A \ a \ a' = B ! b \ A1 = A[a' := A ! a' + 1] \ A2 = A[a := A ! a + 1]$
shows
 $(\neg N ! b \longrightarrow$
 $\text{invar2}' A (B[b := a]) (N[b := \text{True}]) (ai + 1) (ai + 1) \wedge \text{var } A (\{<ai + 1 + 1\} - \{ai + 1\}) < v) \wedge$
 $(N ! b \longrightarrow$
 $(Q ! \text{match } A \ a' \vdash a < a' \longrightarrow \text{invar2}' A1 (B[b := a]) N ai a' \wedge \text{var } A1 (\{<ai + 1\} - \{a'\}) < v) \wedge$
 $(\neg Q ! \text{match } A \ a' \vdash a < a' \longrightarrow \text{invar2}' A2 B N ai a \wedge \text{var } A2 (\{<ai + 1\} - \{a\}) < v))$
 $\langle \text{proof} \rangle$

lemma *Gale-Shapley5-1*: *VARS A B N a a' ai b*
 $[ai = 0 \wedge a = 0 \wedge A = \text{replicate } n \ 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \ \text{False}]$

```

WHILE ai < n
INV { invar2' A B N ai a }
VAR {var A ( $\{<ai+1\} - \{a\}$ )}
DO b := match A a;
IF  $\neg N ! b$ 
THEN B[b] := a; N[b] := True; ai := ai + 1; a := ai
ELSE a' := B ! b;
IF Q ! match A a'  $\vdash a < a'$ 
THEN B[b] := a; A[a'] := A!a'+1; a := a'
ELSE A[a] := A!a+1
FI
FI
OD
[matching A  $\{<n\} \wedge$  stable A  $\{<n\} \wedge$  optiA A]
⟨proof⟩

```

2.11 Algorithm 6: replace Q by ranking R

```

lemma inner-to-outer:
assumes inv: invar2 A B N ai a  $\wedge$  b = match A a and not-b:  $\neg N ! b$ 
shows invar1 A (B[b := a]) (N[b := True]) (ai+1)
⟨proof⟩

lemma inner-pres:
assumes R:  $\forall b < n. \forall a1 < n. \forall a2 < n. R ! b ! a1 < R ! b ! a2 \longleftrightarrow Q ! b \vdash a1 < a2$  and
inv: invar2 A B N ai a and m:  $N ! b$  and v: var A  $\{<ai\} = v$ 
and after: A1 = A[a' := A ! a' + 1] A2 = A[a := A ! a + 1]
a' = B!b r = R ! match A a' b = match A a
shows (r ! a < r ! a'  $\longrightarrow$  invar2 A1 (B[b:=a]) N ai a'  $\wedge$  var A1  $\{<ai\} < v) \wedge$ 
( $\neg r ! a < r ! a' \longrightarrow$  invar2 A2 B N ai a  $\wedge$  var A2  $\{<ai\} < v)$ 
⟨proof⟩

```

First, the ‘old’ version with the more complicated inner variant:

```

lemma Gale-Shapley6:
assumes R = map ranking Q
shows
VARS A B N ai a' b r
[ai = 0  $\wedge$  A = replicate n 0  $\wedge$  length B = n  $\wedge$  N = replicate n False]
WHILE ai < n
INV { invar1 A B N ai }
VAR {z = n - ai}
DO a := ai; b := match A a;
WHILE N ! b
INV { invar2 A B N ai a  $\wedge$  b = match A a  $\wedge$  z = n - ai }
VAR {var A  $\{<ai\}$ }
DO a' := B ! b; r := R ! match A a';
IF r ! a < r ! a'
THEN B[b] := a; A[a'] := A!a'+1; a := a'
ELSE A[a] := A!a+1

```

```

 $FI;$ 
 $b := \text{match } A \text{ a}$ 
 $OD;$ 
 $B[b] := a; N[b] := \text{True}; ai := ai+1$ 
 $OD$ 
 $[\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A]$ 
 $\langle proof \rangle$ 

lemma inner-pres-var2:
assumes  $R: \forall b < n. \forall a1 < n. \forall a2 < n. R ! b ! a1 < R ! b ! a2 \longleftrightarrow Q ! b \vdash a1 < a2$  and
 $\text{inv: } \text{invar2 } A B N ai a \text{ and } m: N ! b \text{ and } v: \text{var2 } A = v$ 
and after:  $A1 = A[a' := A ! a' + 1] A2 = A[a := A ! a + 1]$ 
 $a' = B ! b r = R ! \text{match } A a' b = \text{match } A a$ 
shows  $(r ! a < r ! a' \longrightarrow \text{invar2 } A1 (B[b:=a]) N ai a' \wedge \text{var2 } A1 < v) \wedge$ 
 $(\neg r ! a < r ! a' \longrightarrow \text{invar2 } A2 B N ai a \wedge \text{var2 } A2 < v)$ 
 $\langle proof \rangle$ 

```

The definitive version with variant *var2*:

```

lemma Gale-Shapley6-var2:
assumes  $R = \text{map ranking } Q$ 
shows
 $VARS A B N ai a a' b r$ 
 $[ai = 0 \wedge A = \text{replicate } n 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \text{ False}]$ 
 $WHILE ai < n$ 
 $INV \{ \text{invar1 } A B N ai \}$ 
 $VAR \{ z = n - ai \}$ 
 $DO a := ai; b := \text{match } A a;$ 
 $WHILE N ! b$ 
 $INV \{ \text{invar2 } A B N ai a \wedge b = \text{match } A a \wedge z = n - ai \}$ 
 $VAR \{ \text{var2 } A \}$ 
 $DO a' := B ! b; r := R ! \text{match } A a';$ 
 $IF r ! a < r ! a'$ 
 $THEN B[b] := a; A[a'] := A ! a' + 1; a := a'$ 
 $ELSE A[a] := A ! a + 1$ 
 $FI;$ 
 $b := \text{match } A a$ 
 $OD;$ 
 $B[b] := a; N[b] := \text{True}; ai := ai+1$ 
 $OD$ 
 $[\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A]$ 
 $\langle proof \rangle$ 

```

A less precise version where the inner variant does not depend on variables changed in the outer loop. Thus the inner variant is an upper bound on the number of executions of the inner loop test/body. Superseded by the *var2* version.

```

lemma var0-next2:
assumes  $wf (A[a' := A ! a' + 1]) a' < n$ 

```

shows $\text{var0 } (A[a' := A ! a' + 1]) \{<n\} < \text{var0 } A \{<n\}$
 $\langle \text{proof} \rangle$

lemma *inner-pres2*:
assumes $R: \forall b < n. \forall a1 < n. \forall a2 < n. R ! b ! a1 < R ! b ! a2 \longleftrightarrow Q ! b \vdash a1 < a2$ and
inv: $\text{invar2 } A B N ai a$ and $m: N ! b$ and $v: \text{var0 } A \{<n\} = v$
and *after*: $A1 = A[a' := A ! a' + 1]$ $A2 = A[a := A ! a + 1]$
 $a' = B!b$ $r = R ! \text{match } A a' b = \text{match } A a$
shows $(r ! a < r ! a' \longrightarrow \text{invar2 } A1 (B[b:=a]) N ai a' \wedge \text{var0 } A1 \{<n\} < v) \wedge$
 $(\neg r ! a < r ! a' \longrightarrow \text{invar2 } A2 B N ai a \wedge \text{var0 } A2 \{<n\} < v)$
 $\langle \text{proof} \rangle$

lemma *Gale-Shapley6'*:
assumes $R = \text{map ranking } Q$
shows
 $\text{VARS } A B N ai a a' b r$
 $[ai = 0 \wedge A = \text{replicate } n 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \text{ False}]$
 $\text{WHILE } ai < n$
 $\text{INV } \{ \text{invar1 } A B N ai \}$
 $\text{VAR } \{ z = n - ai \}$
 $\text{DO } a := ai; b := \text{match } A a;$
 $\text{WHILE } N ! b$
 $\text{INV } \{ \text{invar2 } A B N ai a \wedge b = \text{match } A a \wedge z = n - ai \}$
 $\text{VAR } \{ \text{var0 } A \{<n\} \}$
 $\text{DO } a' := B ! b; r := R ! \text{match } A a';$
 $\text{IF } r ! a < r ! a'$
 $\text{THEN } B[b] := a; A[a'] := A ! a' + 1; a := a'$
 $\text{ELSE } A[a] := A ! a + 1$
 $\text{FI};$
 $b := \text{match } A a$
 $\text{OD};$
 $B[b] := a; N[b] := \text{True}; ai := ai + 1$
 OD
 $[\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A]$
 $\langle \text{proof} \rangle$

2.11.1 Algorithm 6.1: single-loop variant

lemma *R-iff-P*:
assumes $R = \text{map ranking } Q$ $\text{invar2}' A B N ai a ai < n N ! \text{match } A a$
shows $(R ! \text{match } A (B ! \text{match } A a) ! a < R ! \text{match } A (B ! \text{match } A a) ! (B ! \text{match } A a)) =$
 $(Q ! \text{match } A (B ! \text{match } A a) \vdash a < B ! \text{match } A a)$
 $\langle \text{proof} \rangle$

lemma *Gale-Shapley6-1*:

assumes $R = \text{map ranking } Q$
shows $\text{VARS } A B N a a' ai b r$
 $[ai = 0 \wedge a = 0 \wedge A = \text{replicate } n 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \text{ False}]$
 $\text{WHILE } ai < n$
 $\text{INV } \{ \text{invar2}' A B N ai a \}$
 $\text{VAR } \{ \text{var } A (\{<ai+1\} - \{a\}) \}$
 $\text{DO } b := \text{match } A a;$
 $\text{IF } \neg N ! b$
 $\text{THEN } B[b] := a; N[b] := \text{True}; ai := ai + 1; a := ai$
 $\text{ELSE } a' := B ! b; r := R ! \text{match } A a';$
 $\text{IF } r ! a < r ! a'$
 $\text{THEN } B[b] := a; A[a'] := A!a'+1; a := a'$
 $\text{ELSE } A[a] := A!a+1$
 FI
 FI
 OD
 $[\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A]$
 $\langle \text{proof} \rangle$

lemma *Gale-Shapley6-1-explicit*:

assumes $R = \text{map ranking } Q$
shows $\text{VARS } A B N a a' ai b r$
 $[ai = 0 \wedge a = 0 \wedge A = \text{replicate } n 0 \wedge \text{length } B = n \wedge N = \text{replicate } n \text{ False}]$
 $\text{WHILE } ai < n$
 $\text{INV } \{ \text{invar2}' A B N ai a \}$
 $\text{VAR } \{ \text{var } A (\{<ai+1\} - \{a\}) \}$
 $\text{DO } b := \text{match } A a;$
 $\text{IF } \neg N ! b$
 $\text{THEN } B[b] := a; N[b] := \text{True}; ai := ai + 1; a := ai$
 $\text{ELSE } a' := B ! b; r := R ! \text{match } A a';$
 $\text{IF } r ! a < r ! a'$
 $\text{THEN } B[b] := a; A[a'] := A!a'+1; a := a'$
 $\text{ELSE } A[a] := A!a+1$
 FI
 FI
 OD
 $[\text{matching } A \{<n\} \wedge \text{stable } A \{<n\} \wedge \text{optiA } A]$
 $\langle \text{proof} \rangle$

end

2.12 Functional implementation

definition

gs-inner P R N =
 $\text{while } (\lambda(A,B,a,b). N!b)$
 $(\lambda(A,B,a,b).$
 $\text{let } a' = B ! b;$

```

 $r = R ! (P ! a' ! (A ! a')) \text{ in}$ 
 $\text{let } (A, B, a) =$ 
 $\quad \text{if } r ! a < r ! a'$ 
 $\quad \text{then } (A[a' := A!a' + 1], B[b := a], a')$ 
 $\quad \text{else } (A[a := A!a + 1], B, a)$ 
 $\text{in } (A, B, a, P ! a ! (A ! a))$ 

```

definition

```

 $gs\ n\ P\ R =$ 
 $\text{while } (\lambda(A,B,N,ai). ai < n)$ 
 $\quad (\lambda(A,B,N,ai).$ 
 $\quad \text{let } (A,B,a,b) = gs\text{-inner } P\ R\ N\ (A, B, ai, P ! ai ! (A ! ai))$ 
 $\quad \text{in } (A, B[b:=a], N[b:=True], ai+1))$ 
 $\quad (replicate\ n\ 0, replicate\ n\ 0, replicate\ n\ False, 0)$ 

```

definition

```

 $gs1\ n\ P\ R =$ 
 $\text{while } (\lambda(A,B,N,ai,a). ai < n)$ 
 $\quad (\lambda(A,B,N,ai,a).$ 
 $\quad \text{let } b = P ! a ! (A ! a) \text{ in}$ 
 $\quad \text{if } \neg N ! b$ 
 $\quad \text{then } (A, B[b := a], N[b := True], ai+1, ai+1)$ 
 $\quad \text{else let } a' = B ! b; r = R ! (P ! a' ! (A ! a')) \text{ in}$ 
 $\quad \text{if } r ! a < r ! a'$ 
 $\quad \text{then } (A[a' := A!a'+1], B[b := a], N, ai, a')$ 
 $\quad \text{else } (A[a := A!a+1], B, N, ai, a))$ 
 $\quad (replicate\ n\ 0, replicate\ n\ 0, replicate\ n\ False, 0, 0)$ 

```

```

context Pref
begin

```

lemma *gs-inner*:

```

assumes  $R = \text{map ranking } Q$ 
assumes  $\text{invar2 } A\ B\ N\ ai\ a\ b = \text{match } A\ a$ 
shows  $gs\text{-inner } P\ R\ N\ (A, B, a, b) = (A', B', a', b') \longrightarrow \text{invar1 } A'\ (B'[b' := a'])$ 
 $(N[b' := True])\ (ai+1)$ 
 $\langle proof \rangle$ 

```

lemma *gs*: **assumes** $R = \text{map ranking } Q$

```

shows  $gs\ n\ P\ R = (A, BNai) \longrightarrow \text{matching } A\ \{<n\} \wedge \text{stable } A\ \{<n\} \wedge \text{optiA } A$ 
 $\langle proof \rangle$ 

```

lemma *gs1*: **assumes** $R = \text{map ranking } Q$

```

shows  $gs1\ n\ P\ R = (A, BNaia) \longrightarrow \text{matching } A\ \{<n\} \wedge \text{stable } A\ \{<n\} \wedge \text{optiA } A$ 
 $\langle proof \rangle$ 

```

end

2.13 Executable functional Code

definition

Gale-Shapley P Q = (if Pref P Q then Some (fst (gs (length P) P (map ranking Q))) else None)

theorem *gs: [Pref P Q; n = length P] \Rightarrow*

$\exists A.$ *Gale-Shapley P Q = Some(A) \wedge Pref.matching P A {<n} \wedge Pref.stable P Q A {<n} \wedge Pref.optiA P Q A*
{proof}

declare *Pref-def [code]*

definition

Gale-Shapley1 P Q = (if Pref P Q then Some (fst (gs1 (length P) P (map ranking Q))) else None)

theorem *gs1: [Pref P Q; n = length P] \Rightarrow*

$\exists A.$ *Gale-Shapley1 P Q = Some(A) \wedge Pref.matching P A {<n} \wedge Pref.stable P Q A {<n} \wedge Pref.optiA P Q A*
{proof}

declare *Pref-def [code]*

Two examples from Gusfield and Irving:

lemma *Gale-Shapley*

$[[3,0,1,2], [1,2,0,3], [1,3,2,0], [2,0,3,1]]$
 $[[3,0,2,1], [0,2,1,3], [0,1,2,3], [3,0,2,1]]$
 $= \text{Some}[0,1,0,1]$

{proof}

lemma *Gale-Shapley1*

$[[4,6,0,1,5,7,3,2], [1,2,6,4,3,0,7,5], [7,4,0,3,5,1,2,6], [2,1,6,3,0,5,7,4],$
 $[6,1,4,0,2,5,7,3], [0,5,6,4,7,3,1,2], [1,4,6,5,2,3,7,0], [2,7,3,4,6,1,5,0]]$
 $[[4,2,6,5,0,1,7,3], [7,5,2,4,6,1,0,3], [0,4,5,1,3,7,6,2], [7,6,2,1,3,0,4,5],$
 $[5,3,6,2,7,0,1,4], [1,7,4,2,3,5,6,0], [6,4,1,0,7,5,3,2], [6,3,0,4,1,2,5,7]]$
 $= \text{Some} [0, 1, 0, 5, 0, 0, 0, 2]$

{proof}

end

3 Part 2: Refinement from lists to arrays

theory *Gale-Shapley2*

imports *Gale-Shapley1 Collections.Diff-Array*

begin

Refinement from lists to arrays, resulting in a linear (in the input size, which is n^2) time algorithm.

```

abbreviation array ≡ new-array
notation array-get (infixl  $\langle\langle \cdot \rangle\rangle$  100)
notation array-set ( $\langle\langle \cdot \cdot \cdot := \cdot \rangle\rangle$  [1000,0,0] 900)
abbreviation list ≡ list-of-array

lemma list-array: list (array x n) = replicate n x
⟨proof⟩

lemma array-get: a !! i = list a ! i
⟨proof⟩

context Pref
begin

3.1 Algorithm 7: Arrays

definition match-array A a = P ! a ! (A !! a)

lemma match-array: match-array A a = match (list A) a
⟨proof⟩

lemmas array-abs = match-array array-list-of-set array-get

lemma Gale-Shapley7:
assumes R = map ranking Q
shows
VARS A B N ai a a' b r
[ai = 0  $\wedge$  A = array 0 n  $\wedge$  B = array 0 n  $\wedge$  N = array False n]
WHILE ai < n
INV { invar1 (list A) (list B) (list N) ai }
VAR {z = n - ai}
DO a := ai; b := match-array A a;
WHILE N !! b
INV { invar2 (list A) (list B) (list N) ai a  $\wedge$  b = match-array A a  $\wedge$  z = n - ai
}
VAR {var (list A) {<ai}}
DO a' := B !! b; r := R ! match-array A a';
IF r ! a < r ! a'
THEN B := B[b := a]; A := A[a' := A !! a' + 1]; a := a'
ELSE A := A[a := A !! a + 1]
FI;
b := match-array A a
OD;
B := B[b := a]; N := N[b := True]; ai := ai + 1
OD
[matching (list A) {<n}  $\wedge$  stable (list A) {<n}  $\wedge$  optiA (list A)]
⟨proof⟩

```

3.2 Algorithm 7.1: single-loop variant

```

lemma Gale-Shapley7-1:
assumes  $R = \text{map ranking } Q$ 
shows  $\text{VARS } A \ B \ N \ a \ a' \ ai \ b \ r$ 
 $[ai = 0 \wedge a = 0 \wedge A = \text{array } 0 \ n \wedge B = \text{array } 0 \ n \wedge N = \text{array False } n]$ 
 $\text{WHILE } ai < n$ 
 $\text{INV } \{ \text{invar2}' (\text{list } A) (\text{list } B) (\text{list } N) ai \ a \}$ 
 $\text{VAR } \{ \text{var} (\text{list } A) (\{<ai+1\} - \{a\}) \}$ 
 $\text{DO } b := \text{match-array } A \ a;$ 
 $\text{IF } \neg N !! b$ 
 $\text{THEN } B := B[b ::= a]; N := N[b ::= \text{True}]; ai := ai + 1; a := ai$ 
 $\text{ELSE } a' := B !! b; r := R ! \text{match-array } A \ a';$ 
 $\quad \text{IF } r ! a < r ! a'$ 
 $\quad \text{THEN } B := B[b ::= a]; A := A[a' ::= A !! a' + 1]; a := a'$ 
 $\quad \text{ELSE } A := A[a ::= A !! a + 1]$ 
 $\quad \text{FI}$ 
 $\quad \text{FI}$ 
 $\quad \text{OD}$ 
 $\quad [ \text{matching } (\text{list } A) \ \{<n\} \wedge \text{stable } (\text{list } A) \ \{<n\} \wedge \text{optiA } (\text{list } A)]$ 
 $\langle \text{proof} \rangle$ 
end

```

3.3 Executable functional Code

```

definition gs-inner where
 $gs\text{-inner } P \ R \ N =$ 
 $\text{while } (\lambda(A,B,a,b). \ N !! b)$ 
 $\quad (\lambda(A,B,a,b).$ 
 $\quad \text{let } a' = B !! b;$ 
 $\quad \quad r = R !! (P !! a' !! (A !! a')) \text{ in}$ 
 $\quad \text{let } (A, B, a) =$ 
 $\quad \quad \text{if } r !! a < r !! a'$ 
 $\quad \quad \text{then } (A[a' ::= A !! a' + 1], B[b ::= a], a')$ 
 $\quad \quad \text{else } (A[a ::= A !! a + 1], B, a)$ 
 $\quad \text{in } (A, B, a, P !! a !! (A !! a)))$ 

definition gs :: nat  $\Rightarrow$  nat array array  $\Rightarrow$  nat array array
 $\Rightarrow$  nat array  $\times$  nat array  $\times$  bool array  $\times$  nat where
 $gs \ n \ P \ R =$ 
 $\text{while } (\lambda(A,B,N,ai). \ ai < n)$ 
 $\quad (\lambda(A,B,N,ai).$ 
 $\quad \text{let } (A,B,a,b) = gs\text{-inner } P \ R \ N \ (A, B, ai, P !! ai !! (A !! ai))$ 
 $\quad \text{in } (A, B[b ::= a], N[b ::= \text{True}], ai+1))$ 
 $\quad (\text{array } 0 \ n, \text{array } 0 \ n, \text{array False } n, 0)$ 

definition gs1 :: nat  $\Rightarrow$  nat array array  $\Rightarrow$  nat array array
 $\Rightarrow$  nat array  $\times$  nat array  $\times$  bool array  $\times$  nat  $\times$  nat where

```

```

gs1 n P R =
  while ( $\lambda(A,B,N,ai,a). ai < n$ )
    ( $\lambda(A,B,N,ai,a).$ 
      let  $b = P !! a !! (A !! a)$ 
      in if  $\neg N !! b$ 
        then  $(A, B[b := a], N[b := True], ai+1, ai+1)$ 
        else let  $a' = B !! b;$ 
           $r = R !! (P !! a' !! (A !! a'))$ 
          in if  $r !! a < r !! a'$ 
            then  $(A[a' := A!!a' + 1], B[b := a], N, ai, a')$ 
            else  $(A[a := A!!a + 1], B, N, ai, a))$ 
      (array 0 n, array 0 n, array False n, 0, 0)

```

definition *pref-array* = *array-of-list o map array-of-list*

lemma *list-list-pref-array*: $i < \text{length } Pa \implies \text{list}(\text{list}(\text{pref-array } Pa) ! i) = Pa ! i$
 $\langle \text{proof} \rangle$

fun *rk-of-pref* :: *nat* \Rightarrow *nat array* \Rightarrow *nat list* \Rightarrow *nat array* **where**
 $\text{rk-of-pref } r \text{ } rs \text{ } (n\#ns) = (\text{rk-of-pref } (r+1) \text{ } rs \text{ } ns)[n := r] \mid$
 $\text{rk-of-pref } r \text{ } rs \text{ } [] = rs$

definition *rank-array1* :: *nat list* \Rightarrow *nat array* **where**
 $\text{rank-array1 } P = \text{rk-of-pref } 0 \text{ } (\text{array } 0 \text{ } (\text{length } P)) \text{ } P$

definition *rank-array* :: *nat list list* \Rightarrow *nat array array* **where**
 $\text{rank-array} = \text{array-of-list o map rank-array1}$

lemma *length-rk-of-pref[simp]*: $\text{array-length}(\text{rk-of-pref } v \text{ } vs \text{ } P) = \text{array-length } vs$
 $\langle \text{proof} \rangle$

lemma *nth-rk-of-pref*:
 $\llbracket \text{length } P \leq \text{array-length } rs; i \in \text{set } P; \text{distinct } P; \text{set } P \subseteq \{\text{length } rs\} \rrbracket$
 $\implies \text{rk-of-pref } r \text{ } rs \text{ } P !! i = \text{index } P \text{ } i + r$
 $\langle \text{proof} \rangle$

lemma *rank-array1-iff-pref*: $\llbracket \text{set } P = \{\text{length } P\}; i < \text{length } P; j < \text{length } P \rrbracket$
 $\implies \text{rank-array1 } P !! i < \text{rank-array1 } P !! j \longleftrightarrow P \vdash i < j$
 $\langle \text{proof} \rangle$

definition *Gale-Shapley* **where**
 $\text{Gale-Shapley } P \text{ } Q =$
 $(\text{if } \text{Pref } P \text{ } Q$
 $\text{then Some } (\text{fst } (\text{gs } (\text{length } P) \text{ } (\text{pref-array } P) \text{ } (\text{rank-array } Q)))$
 $\text{else None})$

definition *Gale-Shapley1* **where**

```

Gale-Shapley1 P Q =
(if Pref P Q
then Some (fst (gs1 (length P) (pref-array P) (rank-array Q)))
else None)

```

```

context Pref
begin

lemma gs-inner:
assumes R = rank-array Q
assumes invar2 (list A) (list B) (list N) ai a b = match-array A a
shows gs-inner (pref-array P) R N (A, B, a, b) = (A',B',a',b')
→ invar1 (list A') ((list B')[b' := a']) ((list N)[b' := True]) (ai+1)
⟨proof⟩

lemma gs: assumes R = rank-array Q
shows gs n (pref-array P) R = (A,B,N,ai) → matching (list A) {<n} ∧ stable
(list A) {<n} ∧ optiA (list A)
⟨proof⟩

lemma R-iff-P:
assumes R = rank-array Q invar2' A B N ai a ai < n N ! match A a
b = match A a a' = B ! b
shows (list (list R ! match A a') ! a < list (list R ! match A a') ! a')
= (Q ! match A a' ⊢ a < a')
⟨proof⟩

lemma gs1: assumes R = rank-array Q
shows gs1 n (pref-array P) R = (A,B,N,ai,a) → matching (list A) {<n} ∧ stable
(list A) {<n} ∧ optiA (list A)
⟨proof⟩

end

theorem gs: [Pref P Q; n = length P] ⇒
∃ A. Gale-Shapley P Q = Some A
∧ Pref.matching P (list A) {<n} ∧ Pref.stable P Q (list A) {<n} ∧ Pref.optiA
P Q (list A)
⟨proof⟩

theorem gs1: [Pref P Q; n = length P] ⇒
∃ A. Gale-Shapley1 P Q = Some A
∧ Pref.matching P (list A) {<n} ∧ Pref.stable P Q (list A) {<n} ∧ Pref.optiA
P Q (list A)
⟨proof⟩

```

Two examples from Gusfield and Irving:

```
lemma list-of-array (the (Gale-Shapley
  [[3,0,1,2], [1,2,0,3], [1,3,2,0], [2,0,3,1]] [[3,0,2,1], [0,2,1,3], [0,1,2,3], [3,0,2,1]]))
  = [0,1,0,1]
  ⟨proof⟩

lemma list-of-array (the (Gale-Shapley
  [[4,6,0,1,5,7,3,2], [1,2,6,4,3,0,7,5], [7,4,0,3,5,1,2,6], [2,1,6,3,0,5,7,4],
   [6,1,4,0,2,5,7,3], [0,5,6,4,7,3,1,2], [1,4,6,5,2,3,7,0], [2,7,3,4,6,1,5,0]]
  [[4,2,6,5,0,1,7,3], [7,5,2,4,6,1,0,3], [0,4,5,1,3,7,6,2], [7,6,2,1,3,0,4,5],
   [5,3,6,2,7,0,1,4], [1,7,4,2,3,5,6,0], [6,4,1,0,7,5,3,2], [6,3,0,4,1,2,5,7]]))
  = [0, 1, 0, 5, 0, 0, 0, 2]
  ⟨proof⟩

end
```

References

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