A Formal Analysis of Algorithms for Matroids and Greedoids

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Best-In-Greedy Algorithm

Properties of the Algorithm

Greedoids

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 formalisation of matroid and greedoid theory with focus on optimisation problems



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- ▶ in the Isabelle/HOL prover



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- 3 executable and verified optimisation algorithms



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- combinatorial optimisation: optimisation problems on discrete structures, e.g. graphs

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Definition (Independence System)

A ground set E and a family of independent sets $\mathcal{F}\subseteq\mathcal{P}(E)$ is an independence system (E,\mathcal{F}) iff

M1. $\emptyset \in \mathcal{F}$

M2. $A \in \mathcal{F}$ and $B \subseteq A$ then $B \in \mathcal{F}$



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M3.
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 and $B \in \mathcal{F}$ and $|B| > |A|$ then $\exists x \in B \setminus A$. $A \cup \{x\} \in \mathcal{F}$



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Definition (Basis)

A basis B of $A \subseteq E$ is an inclusion-maximal independent subset of A. A basis of the independence system $\mathcal{F} \subseteq \mathcal{P}(E)$ is a basis of E.





generalisation of linear independence



- generalisation of linear independence
- ▶ algebraic point of view for some optimisation problems



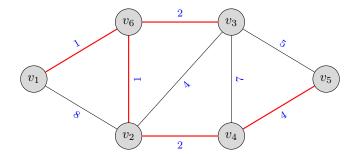
- generalisation of linear independence
- algebraic point of view for some optimisation problems
- weighted matroid optimisation: for costs c, find $X \in \mathcal{F}$ maximising $\sum_{x \in X} c(x)$. (or minimum weight basis)



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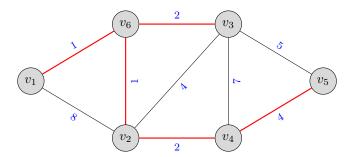


- undirected (multi-)graph with edges E and costs $c: E \to \mathbb{R}^+$
- ► forest = acyclic subgraph
- tree = forest with a single component
- spanning tree minimising/forest maximising accumulated costs



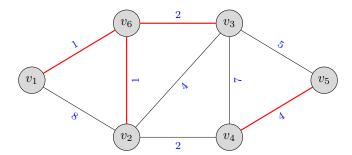


- ightharpoonup carrier set E
- ▶ independent sets: $T \subseteq E$ forming an acyclic subgraph



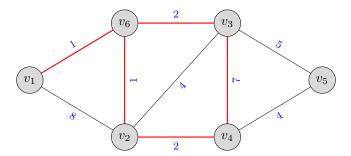


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- lacktriangle independent sets: $T\subseteq E$ forming an acyclic subgraph
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- independent sets are forests
- bases are spanning trees
- maximum weight forest is maximum weight independent set
- minimum spanning tree is minimum weight basis

Theory of Matroids and Greedoids (Selection)



- ▶ Whitney (1935): introduction of matroids
- ► Tutte (1965): Lectures on Matroids, Homotopy Theorem
- Edmonds (1970, 1971): greedy algorithms, Matroid Intersection Theorem
- ► Lawler (1975): matroid intersection algorithms
- Seymour (1980): Decomposition Theorem for Regular Matroids
- Korte and Lovasz (1980): greedoids and greedy algorithms
- many concepts: set system, independence system, matroid, basis, circuit, rank, rank quotient, closure operator, greedoid, accessibility, etc. etc.

our main reference:

Combinatorial Optimization (6th Edition) by Korte and Vygen

Formalisation of Matroids



- ► Mizar: basic matroid theory [Bancerek and Shidama 2008]
- Coq/Rocq: projective geometry and Desargues theorem [Magaud et al. 2012]
- Isabelle/HOL: basic matroid theory [Keinholz 2018], basis for our work
- ▶ Isabelle/HOL: Kruskal's Algorithm [Haslbeck et al. 2018], most related
- ► Lean: matroid theory [Nelson et al. github, 2023 ongoing]
- Coq/Rocq: matroid-based automated prover [Magaud et al. 2024]

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Algorithm 1: BestInGreedy(E, \mathcal{F}, c)

```
Sort E:=\{e_1,\ldots,e_n\} such that c(e_1)\geq c(e_2)\geq \ldots \geq c(e_n); F\leftarrow\emptyset; for i:=1 to n do \ \ \ \ \  if F\cup\{e_i\}\in\mathcal{F} then F\leftarrow F\cup\{e_i\}; return F:
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 - process them one by one



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- ▶ blackbox independence oracle: if $e \in E \setminus F$ and $F \in \mathcal{F}$, is $F \cup \{e\} \in \mathcal{F}$?

The Best-In-Greedy Algorithm



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- ▶ blackbox independence oracle: if $e \in E \setminus F$ and $F \in \mathcal{F}$, is $F \cup \{e\} \in \mathcal{F}$?
- concrete problem: focus on implementing oracle

Formalisation of Algorithm



```
locale Best-In-Greedy = matroid: Matroid-Specs
where set-empty = set-empty for set-empty :: 'set +
fixes carrier :: 'set and indep :: 'set ⇒ bool
  and sort-desc :: ('set ⇒ rat) ⇒ 'a list ⇒ 'a list
  and indep-oracle::'a ⇒ 'set ⇒ bool
```

Formalisation (Loop)



```
function BestInGreedy ::
    ('a, 'set) best-in-greedy-state
     ⇒ ('a, 'set) best-in-greedy-state
where
BestInGreedy state =
 (case (carrier-list state) of
  ] \Rightarrow state
  (x \# xs) \Rightarrow
  (if indep-oracle x (result state) then
      let new-result = (set-insert x (result state)) in
          BestInGreedy
           (state (carrier-list := xs, result := new-result))
   else BestInGreedy (state (carrier-list := xs))))
definition initial-state c order =
  (carrier-list = (sort-desc c order), result = set-empty)
```

Formalisation (Independence Oracle, simplified)



▶ if $e \in E \setminus F$ and $F \in \mathcal{F}$, is $F \cup \{e\} \in \mathcal{F}$?



- data structures to implement sets
- operations and behaviour specified by locale

```
locale Set = fixes empty :: 's fixes insert :: 'a \Rightarrow 's \Rightarrow 's fixes delete :: 'a \Rightarrow 's \Rightarrow 's ... fixes set :: 's \Rightarrow 'a set fixes invar :: 's \Rightarrow bool assumes set-empty: set empty = {} assumes set-insert: invar s \Rightarrow set(insert x s) = set s \cup {x} ...
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locale Set =

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fixes set :: 's \Rightarrow 'a set

fixes invar :: 's \Rightarrow bool

assumes set-empty: set empty = {}

assumes set-insert: invar s

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▶ abstract data types [Wirth 1971, Hoare 1972, Liskov and Zilles 1974]





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- same for other subprocedures, e.g. oracles
- ▶ instantiation to obtain executable algorithms for concrete problems, e.g. Kruskal's Algorithm (for MWF)
- generic for different implementations and matroids
- ▶ stepwise refinement [Wirth 1971 + Hoare 1972]: replace instruction (e.g. $F \cup \{e\} \in \mathcal{F}$?) with more detailed instructions (e.g. does e add a cycle to F?)

Formalisation of the Oracle for Kruskal



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Theorem (Cost Bound [Jenkyns 1976, Korte and Hausmann 1978]) Let (E,\mathcal{F}) be an independence system, with $c:E\to\mathbb{R}_+$. Let F be the output of BestInGreedy. Then $c(F)\!\geq\!q(E,\mathcal{F})\cdot\max_{X\in\mathcal{F}}c(X)$.

- $ightharpoonup q(E,\mathcal{F})$ is the *rank quotient*, a number associated with every independence system
- ▶ $q(E, \mathcal{F}) = 1$ iff (E, \mathcal{F}) is matroid



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Corollary

Let (E, \mathcal{F}) be a matroid, with $c: E \to \mathbb{R}_+$. BestInGreedy finds X with c(X) maximum.



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Let (E, \mathcal{F}) be a matroid, with $c: E \to \mathbb{R}_+$. BestInGreedy finds X with c(X) maximum.

▶ different proof for Corollary 2 already formalised by Haslbeck, Lammich and Biendarra (2018, see AFP).





Theorem (Tightness [Jenkyns 1976, Korte and Hausmann 1978]) Let (E,\mathcal{F}) be an independence system. There exists a cost function $c:E\to\mathbb{R}_+$ s.t. for the output F of BestInGreedy, $c(F){=}q(E,\mathcal{F})\cdot\max_{X\in\mathcal{F}}c(X)$.



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Theorem (Characterisation[Rado 1957, Edmonds 1971])

An independence system (E,\mathcal{F}) is a matroid if and only if BestInGreedy finds an optimal solution for the maximum weight independent set problem for (E,\mathcal{F},c) for all cost functions $c:E\to\mathbb{R}_+$.

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Greedoids



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A ground set E and a family of independent sets $\mathcal{F}\subseteq\mathcal{P}(E)$ is a greedoid iff

M1. $\emptyset \in \mathcal{F}$

M3. $A \in \mathcal{F}$ and $B \in \mathcal{F}$ and |B| > |A| then $\exists x \in B \setminus A$. $A \cup \{x\} \in \mathcal{F}$

Properties of Greedoid Algorithm



Theorem (Korte and Vygen: Characterisation of Strong-Exchange Greedoids)

We fix a greedoid (E, \mathcal{F}) . GreedoidGreedy computes a maximum-weight basis in \mathcal{F} for any order of iteration $e_1, ..., e_n$ and any modular cost function $c: \mathcal{P}(E) \to \mathbb{R}$ iff (E, \mathcal{F}) has the strong exchange property (SEP).

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lacktriangle two matroids (E,\mathcal{F}_1) and (E,\mathcal{F}_2)



- ▶ two matroids (E, \mathcal{F}_1) and (E, \mathcal{F}_2)
- ▶ find $X \in \mathcal{F}_1 \cap \mathcal{F}_2$ with maximum |X|



- ▶ two matroids (E, \mathcal{F}_1) and (E, \mathcal{F}_2)
- ▶ find $X \in \mathcal{F}_1 \cap \mathcal{F}_2$ with maximum |X|
- example: maximum cardinality bipartite matching

Optimality Criterion



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- ▶ for $X \in \mathcal{F}_1 \cap \mathcal{F}_2$, define G_X, S_X, T_X (omitted)
- use oracles

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Theorem (Optimality Criterion by Korte and Vygen)

X is a set of maximum cardinality in $\mathcal{F}_1 \cap \mathcal{F}_2$ iff G_X does not contain a path from some $s \in S_X$ to some $t \in T_X$.

```
definition is-max X = (indep1 X ∧ indep2 X ∧
  (∄ Y. indep1 Y ∧ indep2 Y ∧ card Y > card X))
theorem maximum-characterisation:
  is-max X ←→
  ¬ (∃ p x y. x ∈ S ∧ y ∈ T ∧
      (vwalk-bet (A1 ∪ A2) x p y ∨ x = y))
```





lacktriangle shortest S_X - T_X -paths in G_X of the form $x_0y_1x_1...y_ix_i$



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- ▶ these are augmenting sequences: for $X \in \mathcal{F}_1 \cap \mathcal{F}_2$, $X \cup \{x_0, ..., x_i\} \setminus \{y_1, ..., y_i\} \in \mathcal{F}_1 \cap \mathcal{F}_2$



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Intersection Algorithm: Idea



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- this is an augmentation

Algorithm 2: MaxMatroidIntersection(E, \mathcal{F}_1 , \mathcal{F}_2)

```
[Lawler 1975, Korte and Vygen]
```

```
Initialise X \leftarrow \emptyset:
while True do
   compute G_X: Initialise S_X \leftarrow \emptyset; T_X \leftarrow \emptyset; A_{X,1} \leftarrow \emptyset;
   A_{X,2} \leftarrow \emptyset;
   for y \in E \setminus X do
      if X \cup \{y\} \in \mathcal{F}_1 then S_X \leftarrow S_X \cup \{y\};
       else for x \in X do [ if X \setminus \{x\} \cup \{y\} \in \mathcal{F}_1 then
      A_{X,1} \leftarrow A_{X,1} \cup \{(x,y)\};
      if X \cup \{y\} \in \mathcal{F}_2 then T_X \leftarrow T_X \cup \{y\};
       else for x \in X do [ if X \setminus \{x\} \cup \{y\} \in \mathcal{F}_2 then
       A_{X,2} \leftarrow A_{X,2} \cup \{(y,x)\};
   if \exists path leading from S_X to T_X via the edges in
   A_{X,1} \cup A_{X,2} then
       find a shortest path P = x_0 y_1 x_1 ... y_s x_s leading from S_X to
       T_{\mathbf{Y}}:
       augment along P: X \leftarrow X \cup \{x_0, ..., x_s\} \setminus \{y_1, ..., y_s\};
   else return X as maximum cardinality set in \mathcal{F}_1 \cap \mathcal{F}_2;
```

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greedoids formalised for the first time



- greedoids formalised for the first time
- maximum cardinality matroid intersection



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- uses augmentation (common in combinatorial optimisation)
- algorithmic characterisations of matroids and greedoids





executable algorithms obtained



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- integrated into an Isabelle/HOL library on combinatorial optimisation



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- ▶ 17.4K lines (matroids, greedoids, algorithms: 11K, graphs: 2.9K, instantiation: 3.5K)



- executable algorithms obtained
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- suitable for library: part of reasoning conducted at abstract level/algebraic point of view
- ▶ 17.4K lines (matroids, greedoids, algorithms: 11K, graphs: 2.9K, instantiation: 3.5K)
- disadvantage: performance loss possible





methodology:



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THANK YOU!

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