## On the approximation ratio of Greedy Knapsack

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## Abstract

We justify the claim that the greedy algorithm for knapsack optimization provides 1/2-approximations, that is, solutions whose value is at least half of the optimum. Further, we see that this bound is tight. (**Source**: Section 13.2.2 in G. Brassard and P. Bratley, Fundamentals of Algorithmics, Prentice Hall, 1996.)

Let T be the volume of the knapsack, and  $L = (a_1, \ldots, a_n)$  be a list of items sorted in decreasing unit-value order, that is,

$$value(a_i)/volume(a_i) \ge value(a_{i+1})/volume(a_{i+1})$$

for each  $i \in \{1, 2, ..., n-1\}$ . We can assume that each of the items fits by itself within volume T, since too large items are excluded by the <code>greedyKnapsack</code> procedure anyhow.

For any list of items A, let value(A) and volume(A) denote, respectively, the total value and the total volume of the items in A.

If  $volume(L) \leq T$ , the greedyKnapsack procedure gets an optimal load by taking all of L. Otherwise, let  $a_j \in L$  be the first excluded item, that is,  $volume((a_1, \ldots, a_{j-1})) \leq T$  but  $volume((a_1, \ldots, a_j)) > T$ . Let  $K_{j-1} := (a_1, \ldots, a_{j-1})$  and  $K_j := K_{j-1} \cup (a_j)$ . Now  $K_j$  is an optimal load for  $volume(K_j)$ , since each unit of its space is used by a maximally valuable item that is available. Consider then an optimal load  $K^*$  for volume T. Since  $T < volume(K_j)$ , we must have

$$value(K^*) \le value(K_j)$$
 (1)

Let  $a_{\text{max}}$  be a maximally valuable item of L. The greedyKnapsack procedure computes a load K that includes  $K_{j-1}$  (and possibly some additional items). Then selecting  $K_{\text{greedy}}$  as the more valuable of the loads K and  $(a_{\text{max}})$ , its value

can be estimated as follows:

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value(K_{greedy}) = \max\{value(K), value(a_{max})\}
\geq \max\{value(K_{j-1}), value(a_{j})\}
\geq (value(K_{j-1}) + value(a_{j}))/2
= value(K_{j})/2
\geq value(K^{*})/2  by inequality (1).
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The bound is tight, that is, the error can get arbitrarily close to 50% of the optimum: Consider  $L=(a_1,a_2,a_3)$  where  $value(a_1)=1+\epsilon/2$  and  $volume(a_1)=1+\epsilon/3$  for some  $\epsilon>0$ . Let  $value(a_j)=volume(a_j)=1$  for  $j\in\{2,3\}$ , and let the knapsack volume bound T be 2. The greedy strategy will choose  $K_{\text{greedy}}:=(a_1)$  with  $value(K_{\text{greedy}})=1+\epsilon/2$ , while the value of the optimal load  $K^*=(a_2,a_3)$  is 2, which equals  $2*value(K_{\text{greedy}})-\epsilon$ . So, the value of the optimal load can get arbitrarily close to twice the value of the greedily computed load, by choosing a sufficiently small value for  $\epsilon$ .