

Fractional & Integral Knapsack have optimal substructure.

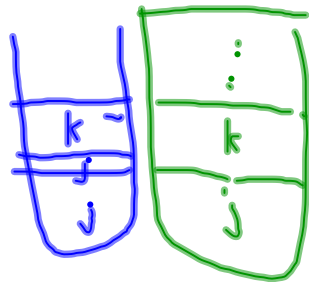
Only fractional problem has greedy choice property.

Statement

Let j be item w/ maximum $\frac{v_i}{w_i}$. Then \exists an opt. sol'n in which you take as much of j as possible.

Pf Suppose you didn't take as much as possible of item j , (and the knapsack is full). Then there exists some item k , w/ $\frac{v_k}{w_k} < \frac{v_j}{w_j}$ that is in the knapsack.

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not all of j is in

Then take a wt. ϵ piece of k out,
add a wt. ϵ piece of j in.

Increase knapsack value by

$$\epsilon \frac{v_j}{w_j} - \epsilon \frac{v_k}{w_k} = \epsilon \left(\frac{v_j}{w_j} - \frac{v_k}{w_k} \right) > 0 \quad \otimes$$

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Alg

1. Sort items by v_j/w_j , remember.

2 for $i = 1$ to n

 Add as much as possible of item i

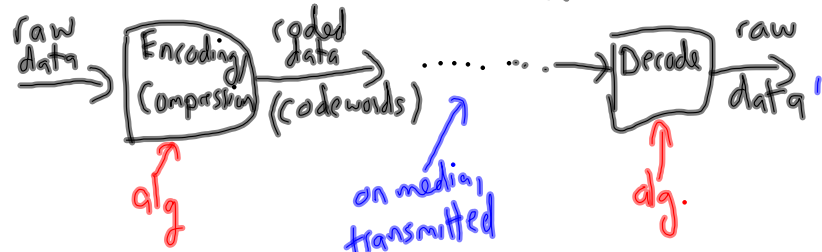
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2	w20	1	w10
	v100		v60
3	w30		
	v120		

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Huffman Codes (compression)

- data on media (CD, DVD)
- data over the internet



→ lossless - encode/decode → get back original data
lossy - " → get back an approx. of original data

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Encode English letters
Standard encoding
ASCII - 8 bits

$$2^8 = 255$$

standard encoding of k symbols,
you need $\lceil \lg k \rceil$ bits

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encoding alg.

face

101000010100

decoding alg.

'code'

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Take advantage of different frequencies of letters in English.

E T A S I O

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huff.pdf (application/pdf Object) - Mozilla Firefox

http://www.columbia.edu/~cs2035/courses/csor4231.F09/huff.pdf

Different types of codes

- **fixed length code.** Each codeword uses the same number of bits.
- **variable length code.** Codewords can use differing numbers of bits.

Example

character	frequency	fixed length code	variable length code
a	.45		1
b	.13		1
c	.12		2
d	.16		2
e	.09		2
f	.05		2

$$.45(1) + .13(1) + .12(2) + .16(2) + .09(2) + .05(2) < 2$$

11.00 x 8.50 in

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a	0	face 1100010 bhagabg fcda ...
b	1	
c	00	
d	01	
e	10	
f	11	

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http://www.columbia.edu/~cs2035/courses/csor4231.F09/huff.pdf

• **variable length code.** Codewords can use differing numbers of bits.

character	frequency	fixed length code	variable length code
a	.45	000	0
b	.13	001	101
c	.12	010	100
d	.16	011	111
e	.09	100	1101
f	.05	101	1100

*Handwritten: 110001001101
f a c e*

Evaluation of code: Expected number of bits per codeword.

Fixed length code: 3

Variable length code:

$$.45(1) + .13(3) + .12(3) + .16(3) + .09(4) + .05(4) = 2.24$$

Prefix free codes: No codeword is a prefix of any other codeword.

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Handwritten:

a	0	0	
b	101	10	
c	100	110	.45
d	111	1110	
e	1101	11110	
f	1100	111110	

path (→) codewords

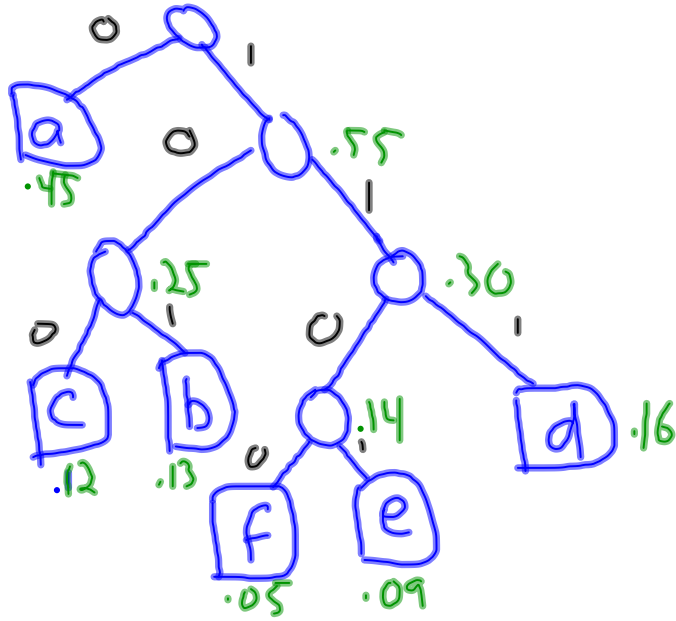
face

110001001101

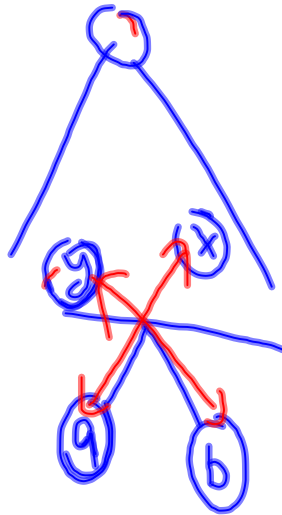
f a c e

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a .45
 b .17
 c .12
 d .16
 e .09
 f .05
~~ef .14~~
~~bc .25~~
~~df .3~~
 .55



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x y lowest freq.

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http://www.columbia.edu/~cs2035/courses/csr4231.F09/huff.pdf

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- Let a and b be two characters that are sibling leaves of maximum depth in T . (wlog, $f[a] \leq f[b]$ and $f[x] \leq f[y]$.)
- $f[x] \leq f[a]$ and $f[y] \leq f[b]$, since $f[x]$ and $f[y]$ are the two lowest leaf frequencies.
- Exchange the positions in T of a and x to produce a tree T' .
- Exchange the positions in T' of b and y to produce a tree T'' .

Now look at the difference between $B(T)$ and $B(T')$

$$\begin{aligned}
 B(T) - B(T') &= \sum_{c \in C} f(c)d_T(c) - \sum_{c \in C} f(c)d_{T'}(c) \\
 &= f[x]d_T(x) + f[a]d_T(a) - f[x]d_{T'}(x) - f[a]d_{T'}(a) \\
 &= f[x]d_T(x) + f[a]d_T(a) - f[x]d_{T'}(a) - f[a]d_{T'}(x) \\
 &= (f[a] - f[x])(d_T(a) - d_T(x)) \\
 &\geq 0,
 \end{aligned}$$

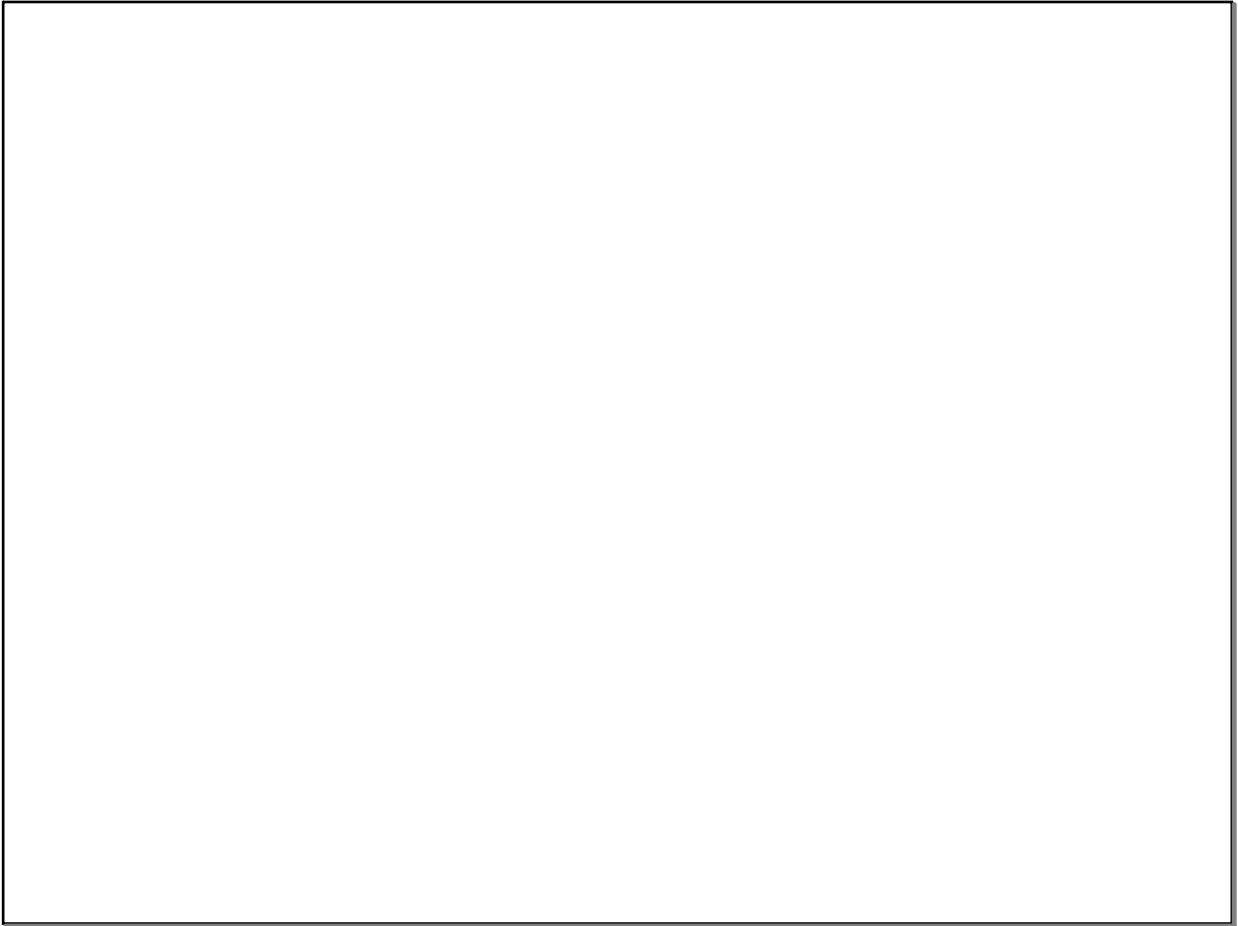
Reasons for last inequality:

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Assuming
 - each character is encoded individually
 into an integral # of bits,
 Huffman coding is optimal
 (minimized expected # of bits
 transmitted)

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