# Solutions to Written Exam in <br> Data compression TSBK08 

20th March 2023

1 a) See the course literature.
b) See the course literature.
c) See the course literature.
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4 Probabilities $p\left(x_{i}, x_{i+1}\right)=p\left(x_{i}\right) \cdot p\left(x_{i+1}\right)$ for pairs of symbols:

$$
\begin{aligned}
& p(a, a)=0.36, \quad p(a, b)=0.21, \quad p(a, c)=0.03 \\
& p(b, a)=0.21, \quad p(b, b)=0.1225, \quad p(b, c)=0.0175 \\
& p(c, a)=0.03, \quad p(c, b)=0.0175, \quad p(c, c)=0.0025
\end{aligned}
$$

A Huffman code for this distribution gives the mean codeword length $\bar{l}=2.435$ bits/codeword and average data rate $R=\frac{l}{2}=$ 1.2175 bits/symbol.
a) Given states $\left(x_{i}, x_{i-1}\right)$, the state diagram looks like


The stationary probabilities for this model is

$$
w_{w w}=\frac{17}{28}, w_{w b}=\frac{2}{28}, w_{b w}=\frac{2}{28}, w_{b b}=\frac{7}{28}
$$

These probabilities are also probabilities for pairs $p\left(x_{i}, x_{i-1}\right)$.
b) The pair probabilities from above gives us the entropy $H\left(X_{i}, X_{i-1}\right) \approx 1.4810$. Probabilties for single symbols can be found as marginal probabilities

$$
p(w)=p(w, w)+p(w, b)=\frac{19}{28}, \quad p(b)=p(b, w)+p(b, b)=\frac{9}{28}
$$

which gives us the entropy $H\left(X_{i}\right) \approx 0.9059$. Using the chain rule, we find $H\left(X_{i} \mid X_{i-1}\right)=H\left(X_{i}, X_{i-1}\right)-H\left(X_{i-1}\right) \approx 0.5751$. Finally, we need probabilities for three symbols

$$
\begin{aligned}
p\left(x_{i}, x_{i-1}, x_{i-2}\right) & =p\left(x_{i-1}, x_{i-2}\right) \cdot p\left(x_{i} \mid x_{i-1}, x_{i-2}\right) \\
p(w, w, w) & =\frac{153}{280}, \quad p(b, w, w)=\frac{17}{280} \\
p(w, w, b) & =\frac{17}{280}, \quad p(b, w, b)=\frac{3}{280} \\
p(w, b, w) & =\frac{6}{280}, \quad p(b, b, w)=\frac{14}{280} \\
p(w, b, b) & =\frac{14}{280}, \quad p(b, b, b)=\frac{56}{280}
\end{aligned}
$$

This gives us the entropy $H\left(X_{i}, X_{i-1}, X_{i-2}\right) \approx 2.0527$.
Using the chain rule we find

$$
H\left(X_{i} \mid X_{i-1}, X_{i-2}\right)=H\left(X_{i}, X_{i-1}, X_{i-2}\right)-H\left(X_{i-1}, X_{i-2}\right) \approx 0.5717
$$

6 Assuming that we always place the $b$ interval closest to 0 , the sequence corresponds to the interval $[0.3118240 .32203)$. The interval size is 0.010206 and thus we will need at least $\left\lceil-\log _{2} 0.010206\right\rceil=7$ bits in our codeword, maybe one more.
Write the two interval limits as binary numbers:

$$
\begin{aligned}
0.311824 & =0.010011111101001 \ldots \\
0.32203 & =0.010100100111000 \ldots
\end{aligned}
$$

The smallest seven bit number inside the interval is 0.0101000 , and all numbers starting with these bits are also inside the interval (ie smaller than the upper interval limit). Thus, seven bits are enough. The codeword is $\mathbf{0 1 0 1 0 0 0}$.
$7 \quad$ The decoded sequence is

> bedbadbededebabebabbabb...
and the dictionary looks like

| index | word | index | word | index | word | index | word |
| :---: | :--- | :---: | :---: | :---: | :--- | :---: | :--- |
| 0 | $a$ | 5 | $b e$ | 10 | $d b e$ | 15 | $b a b b$ |
| 1 | $b$ | 6 | $e d$ | 11 | $e d e$ | 16 | $b a b b *$ |
| 2 | $c$ | 7 | $d b$ | 12 | $e d e b$ | 17 |  |
| 3 | $d$ | 8 | $b a$ | 13 | $b a b$ | 18 |  |
| 4 | $e$ | 9 | $a d$ | 14 | $b e b$ | 19 |  |

where we don't know * until we have decoded the next index.

8 Inverse mtf gives the vector $L=\left[\begin{array}{ccc}c & c a b b\end{array}\right]$.
Sort the sequence to get the vector $F=\left[\begin{array}{ll}a a b b b c c c\end{array}\right]$ which gives us the vector $T=\left[\begin{array}{llll}3 & 4 & 6 & 7 \\ 0 & 12\end{array}\right]$ (the position in $L$ where you find each symbol in $F$ ).
Inverse BWT gives the sequence cabcbcab.

