# CRAM codec specification (version 3.1)

samtools-devel@lists.sourceforge.net

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The master version of this document can be found at https://github.com/samtools/hts-specs. This printing is version 7efd204 from that repository, last modified on the date shown above.

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#### 1 Introduction

This document covers the compression and decompression algorithms (codecs) specific to the CRAM format. All bar the first of these were introduced in CRAM v3.1.

It does not cover the CRAM format itself. For that see http://samtools.github.io/hts-specs/.

#### 1.1 Pseudocode introduction

Various parts of this specification are written in a simplistic pseudocode. This intentionally does not make explicit use of data types and has minimal error checking. The number of operators is kept to a minimum, but some are necessary and may be language specific. Due to the lack of explicit data types, we also have different division operators to symbolise floating point and integer divisions.

The pseudocode doesn't prescribe any particular programming paradigm - functional, procedural or object oriented - but it does have a few implicit assumptions. Variables are considered to be passed between functions via unspecified means. For example the Range Coder sets range and code during creation and these are used during the decoding steps, but are not explicitly passed in as variables. We make the implicit assumption that they are simply local variables of the particular usage of this range coder. Other than ephemeral loop counters, we do not reuse variable names so the intention should be clear.

The exception to the above is occasionally we need to have multiple instances of a particular data type, such as Order-1 decoding will have many models. Here we use an object oriented way of describing the problem with *instance*.FUNCTION notation.

Note some functions may return multiple items, such as return (value, length), but the calling code may assign a single variable to this result. In this case the first value value will be used and length will be discarded.

### 1.2 Mathematical operators

Operator	Description		
a+b	Addition		
a-b	Subtraction		
$a \times b$	Multiplication		
a / b	Floating point division $a/b$		
	Integer division $a/b$ , equivalent to $\lfloor a/b \rfloor$		
$a \bmod b$	Integer modulo (remainder) $a - b \times (a \text{ div } b)$		
a = b	Compares $a$ and $b$ variables, yielding true if they match, false otherwise		
$a \leftarrow b$	Assigns value of $b$ to variable $a$		
$a \ll b$	Bit-wise left shift $a$ by $b$ bits, shifting in zeros		
$a \gg b$	Bit-wise right shift $a$ by $b$ bits, shifting in zeros		
a  AND  b	Bit-wise AND operator, joining values $a, b$		
a  OR  b	Bit-wise OR operator, joining values $a, b$		
$a \mathbf{ or } b$	Logical OR operator, joining expressions $a, b$		
a and $b$	Logical AND operator, joining expressions $a, b$		
a + b	String concatenation of $a$ and $b$ : $ab$		
$V_{i}$	Element $i$ of vector $V$		
	The entire vector $V$ may be passed into a function		
$W_{i,j}$	Element $i, j$ of two-dimensional vector $W$ .		
	The entire vector $W$ or a one dimensional slice $W_i$ (of size $j$ ) may be passed into a function.		

Note that string concatenation with the  $\pm$  operator assumes the left and right values are converted to string form. For example "level"  $\pm$  42 will convert the integer 42 to "42" and produce the string "level42".

### 1.3 Implicit functions

Operator	Description
Min(a, b)	Smaller of $a$ and $b$
Max(a, b)	Larger of $a$ and $b$
READUINT8	Read an 8-bit unsigned integer (1 byte) from unspecified input source
ReadUint32	Read a 32-bit unsigned little-endian integer from unspecified input source
ReadUint8 $(src)$	Read an 8-bit unsigned integer (1 byte) from input $src$
ReadUint $32(src)$	Read a 32-bit unsigned little-endian integer from input $src$
ReadData $(len)$	Read $len$ bytes (8-bit unsigned) from an unspecified input source
ReadData $(len, src)$	Read $len$ bytes (8-bit unsigned) from input $src$
ReadChar $(src)$	Read a single character from input $src$
ReadString $(src)$	Read a nul-terminated string from input $src$
EOF	Returns true if the input source is exhausted.
CHAR(a)	Converts integer $a$ to a single character of appropriate ASCII value
Length(a)	Returns length of string $a$ excluding any nul-termination bytes
SWAP $(a, b)$	Swaps the contents of $a$ and $b$ variables

Many of the input functions here and below are defined to read either from an unspecified input source (such as the input file descriptor, or a global buffer that has not been explicitly stated in the pseudocode), but also have forms that may decode from specified inputs / buffers. They both consume their input sources in the same manner, using an implicit offset of how many bytes so far have been read.

#### 1.4 Other basic functions

7-bit integer encoding stores values 7-bits at a time with the top bit set if further bytes are required.

(Read a variable sized unsigned integer 7-bits at a time. Returns the value.)

- 1: **function** READUINT7(source)  $\triangleright$  If source is unspecified then it is the default input stream
- 2:  $value \leftarrow 0$
- 3:  $length \leftarrow 0$
- 4: repeat

```
5: c \leftarrow \text{READUINT8}

6: value \leftarrow (value << 7) + (c \text{ AND } 127)

7: length \leftarrow length + 1

8: \mathbf{until}\ c < 128

9: \mathbf{return}\ value

10: \mathbf{end}\ \mathbf{function}
```

ITF8 integer encoding stores the additional number of bytes needed in the count of the top bits set in the initial byte (ending with a zero bit), followed by any subsequent whole bytes. See the main CRAM specification for more details.

(Read a variable sized unsigned integer with ITF8 encoding. Returns the value.)

```
1: function READITF8(source)
                                                                   ▶ If source is unspecified then it is the default input stream
         v \leftarrow \text{ReadUint8}
 2:
         if i >= 0xf0 then
                                                                                                                  \triangleright 1111xxxx => +4 \text{ bytes}
 3:
             v \leftarrow (v \text{ AND OxOf}) \ll 28
 4:
 5:
             v \leftarrow v + (\text{READUINT8} << 20)
             v \leftarrow v + (\text{ReadUint8} << 12)
 6:
             v \leftarrow v + (\text{ReadUint8} << 4)
 7:
             v \leftarrow v + (\text{ReadUint8} >> 4)
 8:
 9:
         else if i >= 0xe0 then
                                                                                                                  \triangleright 1110xxxx => +3 \text{ bytes}
             v \leftarrow (v \text{ AND OxOf}) \ll 24
10:
             v \leftarrow v + (\text{ReadUint8} << 16)
11:
             v \leftarrow v + (\text{READUINT8} << 8)
12:
             v \leftarrow v + \text{ReadUint8}
13:
                                                                                                                  \triangleright 110xxxxx => +2 \text{ bytes}
         else if i >= 0xc0 then
14:
             v \leftarrow (v \text{ AND Ox1f}) << 16
15:
             v \leftarrow v + (\text{READUINT8} << 8)
16:
             v \leftarrow v + \text{ReadUint8}
17:
         else if i >= 0x80 then
                                                                                                                  \triangleright 10xxxxxx => +1 \text{ bytes}
18:
             v \leftarrow (v \text{ AND Ox3f}) << 8
19:
             v \leftarrow v + \text{ReadUint8}
20:
21:
         end if
         return v
22:
23: end function
```

# 2 rANS 4x8 - Asymmetric Numeral Systems

This is the rANS format first defined in CRAM v3.0.

rANS is the range-coder variant of the Asymmetric Numerical Systems<sup>1</sup>.

The structure of the external rANS codec consists of several components: meta-data consisting of compression-order, and compressed and uncompressed sizes; normalised frequencies of the alphabet systems to be encoded, either in Order-0 or Order-1 context; and the rANS encoded byte stream itself.

Here "Order" refers to the number of bytes of context used in computing the frequencies. It will be 0 or 1. Ignoring punctuation and space, an Order-0 analysis of English text may observe that 'e' is the most common letter (12-13%), and that 'u' occurs only around 2.5% of the time. If instead we consider the frequency of a letter in the context of one previous letter (Order-1) then these statistics change considerably; we know that if the previous letter was 'q' then 'e' becomes a rare letter while 'u' is the most likely.

These observed frequencies are inversely related to the amount of storage required to encode a symbol (e.g. an alphabet letter) $^2$ .

<sup>&</sup>lt;sup>1</sup>J. Duda, Asymmetric numeral systems: entropy coding combining speed of Huffman coding with compression rate of arithmetic coding, http://arxiv.org/abs/1311.2540

<sup>&</sup>lt;sup>2</sup> C.E. Shannon, A Mathematical Theory of Communication, Bell System Technical Journal, vol. 27, pp. 379-423, 623-656, July, October, 1948

#### rANS 4x8 compressed data structure

A compressed data block consists of the following logical parts:

Value data type	Name	Description
byte	order	the order of the codec,
		either 0 or 1
uint32	compressed size	the size in bytes of
		frequency table and
		compressed blob
uint32	data size	raw or uncompressed
		data size in bytes
byte[]	frequency table	byte frequencies of
		input data written
		using RLE
byte[]	compressed blob	compressed data

#### 2.1 Frequency table

The alphabet used here has a maximum of 256 possible symbols (all byte values), but alphabets where fewer symbols are permitted too.

The symbol frequency table indicates which symbols are present and what their relative frequencies are. The total sum of symbol frequencies are normalised to add up to  $4095^3$ . Given rounding differences when renormalising to a fixed sum, it is up to the encoder to decide how to distribute any remainder or remove excess frequencies. The normalised frequency tables below are examples and not prescriptive of a specific normalisation strategy.

Formally, this is an ordered alphabet  $\mathbb{A}$  containing symbols s where  $s_i$  with the i-th symbol in  $\mathbb{A}$ , occurring with the frequency  $freq_i$ .

#### Order-0 encoding

The normalised symbol frequencies are then written out as {symbol, frequency} pairs in ascending order of symbol (0 to 255 inclusive). If a symbol has a frequency of 0 then it is omitted.

To avoid storing long consecutive runs of symbols if all are present (eg a-z in a long piece of English text) we use run-length-encoding on the alphabet symbols. If two consecutive symbols have non-zero frequencies then a counter of how many other non-zero frequency consecutive symbols is output directly after the second consecutive symbol, with that many symbols being subsequently omitted.

For example for non-zero frequency symbols 'a', 'b', 'c', 'd' and 'e' we would write out symbol 'a', 'b' and the value 3 (to indicate 'c', 'd' and 'e' are also present).

The frequency is output after every symbol (whether explicit or implicit) using ITF8 encoding. This means that frequencies 0-127 are encoded in 1 byte while frequencies 128-4095 are encoded in 2 bytes.

Finally the symbol 0 is written out to indicate the end of the symbol-frequency table.

As an example, take the string abracadabra.

Symbol frequency:

Symbol	Frequency
a	5
b	2
c	1
d	1
r	2

Normalised to sum to 4095:

Symbol	Frequency
a	1863
b	744
c	372
d	372
r	744

Encoded as:

<sup>&</sup>lt;sup>3</sup>While the maths work fine up to 4096, for historical reasons this has always been documented as having a limit of 4095. Implementations may wish to validate decoding on <= 4096, but we recommend they use a limit of 4095 in their encoding output.

```
0x61
          0x87 0x47
                           # 'a'
                                            <1863>
                           # 'b' <+2: c,d>
0x62 0x02 0x82 0xe8
                                             <744>
          0x81 0x74
                           # 'c' (implicit) <372>
                          # 'd'
                                 (implicit) <372>
          0x81 0x74
                           # 'r'
0x72
          0x82 0xe8
                                             <744>
0x00
                           # <0>
```

#### Order-1 encoding

To encode Order-1 statistics typically requires a larger table as for an N sized alphabet we need to potentially store an  $N \times N$  matrix. We store these as a series of Order-0 tables.

We start with the outer context byte, emitting the symbol if it is non-zero frequency. We perform the same run-length-encoding as we use for the Order-0 table and end the contexts with a nul byte. After each context byte we emit the Order-0 table relating to that context.

One last caveat is that we have no context for the first byte in the data stream (in fact for 4 equally spaced starting points, see "interleaving" below). We use the ASCII value ('\0') as the starting context for each interleaved rANS state and so need to consider this in our frequency table.

Consider abracadabraabracadabraabracadabraabracadabra as example input. Note for the last "a" was omitted from this string in order to demonstrate how the method works when the data is not a multiple of 4 long. This can be broken into 4 approximate equal portions abracadabra abracadabra abracadabra abracadabra. We operate one independent rANS stream per portion, providing us the opportunity to exploit CPU data parallelism.

Naively observed Order-1 frequencies:

Normali	ısed (	per	Order-0	statist	1CS

Context	Symbol	Frequency
\0	a	4
a	a	3
	b	8
	c	4
	d	4
b	r	8
c	a	4
d	a	4
r	a	7

Context	Symbol	Frequency
$\setminus 0$	a	4095
a	a	646
	b	1725
	c	862
	d	862
b	r	4095
c	a	4095
d	a	4095
r	a	4095

Note that the above table has redundant entries. While our complete string had three cases of two consecutive "a" characters ("...cadabraabraca..."), these spanned the junction of our split streams and each rANS state is operating independently, starting with the same last character of nul (0). Hence during decode we will not need to access the table for the frequency of "a" in the context of a previous "a". A similar issue occurs for the very last byte used for each rANS state, which will not be used as a context. In extreme cases this may even be the only time that symbols occurs anywhere. While these scenarios represent unnecessary data to store, and these frequency entries can be safely omitted, their presence does not invalidate the data format and it may be simpler to use a more naive algorithm when producing the frequency tables.

The above tables are encoded as:

```
0x00
                      # '\0' context
0x61
          0x8f 0xff
                     # a <4095>
                      # end of Order-O table
0x00
0x61
                      # 'a' context
0x61
          0x82 0x86
                     # a
                                     <646>
0x62 0x02 0x86 0xbd
                     # b <+2: c,d> <1725>
                     # c (implicit) <862>
          0x83 0x5e
          0x83 0x5e
                     # d (implicit) <862>
                      # end of Order-O table
0x00
                      # 'b' context, <+2: c, d>
0x62 0x02
```

```
0x72
          0x8f 0xff # r <4095>
0x00
                     # end of Order-O table
                     # 'c' context (implicit)
          0x8f 0xff
                     # a <4095>
0x61
0x00
                     # end of Order-O table
                     # 'd' context (implicit)
          0x8f 0xff # a <4095>
0x61
0x00
                     # end of Order-O table
                     # 'r' context
0x72
          0x8f 0xff # a <4095>
0x61
00x0
                     # end of Order-0 table
0x00
                     # end of contexts
```

### 2.2 rANS entropy encoding

The encoder takes a symbol s and a current state x (initially L below) to produce a new state x' with function C.

$$x' = C(s, x)$$

The decoding function D is the inverse of C such that C(D(x)) = x.

$$D(x') = (s, x)$$

The entire encoded message can be viewed as a series of nested C operations, with decoding yielding the symbols in reverse order, much like popping items off a stack. This is where the asymmetric part of ANS comes from.

As we encode into x the value will grow, so for efficiency we ensure that it always fits within known bounds. This is governed by

$$L \le x < bL - 1$$

where b is the base and L is the lower-bound.

We ensure this property is true before every use of C and after every use of D. Finally to end the stream we flush any remaining data out by storing the end state of x.

#### Implementation specifics

We use an unsigned 32-bit integer to hold x. In encoding it is initialised to L. For decoding it is read little-endian from the input stream.

Recall  $freq_i$  is the frequency of the *i*-th symbol  $s_i$  in alphabet  $\mathbb{A}$ . We define  $cfreq_i$  to be cumulative frequency of all symbols up to but not including  $s_i$ :

$$cfreq_i = \begin{cases} 0 & \text{if } i < 1\\ cfreq_{i-1} + freq_{i-1} & \text{if } i \ge 1 \end{cases}$$

We have a reverse lookup table  $cfreq\_to\_sym_c$  from 0 to 4095 (0xfff) that maps a cumulative frequency c to a symbol s.

$$cfreq\_to\_sym_c = s_i$$
 where  $c: cfreq_i \le c < cfreq_i + freq_i$ 

The x' = C(s, x) function used for the *i*-th symbol s is:

$$x' = (x/freq_i) \times 0 \times 1000 + cfreq_i + (x \mod freq_i)$$

The D(x') = (s, x) function used to produce the *i*-th symbol s and a new state x is:

$$\begin{split} c &= x' \text{ AND Oxfff} \\ s_i &= cfreq\_to\_sym_c \\ x &= freq_i(x'/\text{Ox1000}) + c - cfreq_i \end{split}$$

Most of these operations can be implemented as bit-shifts and bit-AND, with the encoder modulus being implemented as a multiplication by the reciprocal, computed once only per alphabet symbol.

We use L = 0x800000 and b = 256, permitting us to flush out one byte at a time (encoded and decoded in reverse order).

Before every encode C(s, x) we renormalise x, shifting out the bottom 8 bits of x until  $x < 0x80000 \times freq_i$ . After finishing all encoding we flush 4 more bytes (lowest 8-bits first) from x.

After every decoded D(x') we renormalise x', shifting in the bottom 8 bits until  $x \ge 0x800000$ .

#### Interleaving

For efficiency, we interleave 4 separate rANS codecs at the same time<sup>4</sup>. For the Order-0 codecs these simply encode or decode the 4 neighbouring bytes in cyclic fashion using interleaved codec 0, 1, 2, and 3, sharing the same output buffer (so the output bytes get interleaved).

For the Order-1 codec we cannot do this as we need to know the previous byte value as the context for the next byte. We therefore split the input data into 4 approximately equal sized fragments<sup>5</sup> starting at 0,  $\lfloor len/4 \rfloor$ ,  $\lfloor len/4 \rfloor \times 2$  and  $\lfloor len/4 \rfloor \times 3$ . Each Order-1 codec operates in a cyclic fashion as with Order-0, all starting with 0 as their state and sharing the same compressed output buffer. Any remainder, when the input buffer is not divisible by 4, is processed at the end by the 4th rANS state.

We do not permit Order-1 encoding of data streams smaller than 4 bytes.

### 2.3 rANS decode pseudocode

A naïve implementation of a rANS decoder follows. This pseudocode is for clarity only and is not expected to be performant and we would normally rewrite this to use lookup tables for maximum efficiency. The function READUINT8 fetches the next single unsigned byte from an unspecified input source. Similarly for READITF8 (variable size integer) and READUINT32 (32-bit unsigned integer in little endian format).

```
1: procedure RANSDECODE(input, output)
       order \leftarrow \text{ReadUint8}
                                                                                           \triangleright Implicit read from input
       n in \leftarrow \text{ReadUint}32
3:
       n out \leftarrow ReadUint32
4:
6:
       if order = 0 then
           RansDecode0(output, n\_out)
7:
8:
       else
           RansDecode1(output, n out)
9:
       end if
10:
11: end procedure
```

#### rANS order-0

The Order-0 code is the simplest variant. Here we also define some of the functions for manipulating the rANS state, which are shared between Order-0 and Order-1 decoders.

```
(Reads a table of Order-0 symbol frequencies F_i)
(and sets the cumulative frequency table C_{i+1} = C_i + F_i)

1: procedure ReadFrequencies0(F, C)

2: s \leftarrow \text{ReadUint8} \triangleright Next alphabet symbol

3: last\_sym \leftarrow s

4: rle \leftarrow 0

5: repeat

6: F_s \leftarrow \text{ReadITF8}

7: if rle > 0 then

8: rle \leftarrow rle - 1
```

<sup>&</sup>lt;sup>4</sup>F. Giesen, *Interleaved entropy coders*, http://arxiv.org/abs/1402.3392

<sup>&</sup>lt;sup>5</sup>This was why the '\0'  $\rightarrow$  'a' context in the example above had a frequency of 4 instead of 1.

```
9:
                   \leftarrow s + 1
           else
10:
               s \leftarrow \text{ReadUint8}
11:
               if s = last\_sym + 1 then
12:
                   rle \leftarrow \text{ReadUint8}
13:
               end if
14:
           end if
15:
           last \ sym \leftarrow s
16:
        until s = 0
17:
       (Compute cumulative frequencies C_i from F_i)
        C_0 \leftarrow 0
18:
       for s \leftarrow 0 to 255 do
19:
           C_{s+1} \leftarrow C_s + F_s
20:
        end for
21:
22: end procedure
    (Bottom 12 bits of our rANS state R are our frequency)
   function RansGetCumulativeFreq(R)
       \mathbf{return}\ R\ \mathrm{AND}\ 0\mathrm{xfff}
24:
25: end function
    (Convert frequency to a symbol. Find s such that C_s \leq f < C_{s+1})
    (We would normally implement this via a lookup table)
26: function RansGetSymbolFromFreq(C, f)
27:
        s \leftarrow 0
        while f >= C_{s+1} do
28:
           s \leftarrow s+1
29:
30:
        end while
       return s
31:
32: end function
    (Compute the next rANS state R given frequency f and cumulative freq c)
   function RansadvanceStep(R, c, f)
        return f \times (R \gg 12) + (R \text{ AND } 0xfff) - c
34:
35: end function
    (If too small, feed in more bytes to the rANS state R)
36: function RansRenorm(R)
        while R < (1 << 23) do
37:
           R \leftarrow (R << 8) + \text{ReadUint8}
38:
        end while
39:
       return R
40:
41: end function
   procedure RansDecode0(output, nbytes)
        READFREQUENCIES 0(F, C)
43:
        for j \leftarrow 0 to 3 do
                                                                                    ▷ Initialise the 4 interleaved streams
44:
           R_i \leftarrow \text{ReadUint}32
                                                                                          ▷ Unsigned 32-bit little endian
45:
        end for
46:
       for i \leftarrow 0 to nbytes - 1 do
47:
           j \leftarrow i \mod 4
48:
           f \leftarrow \text{RansGetCumulativeFreq}(R_i)
49:
           s \leftarrow \text{RansGetSymbolFromFreq}(C, f)
50:
           output_i \leftarrow s
51:
           R_j \leftarrow \text{RANSADVANCESTEP}(R_j, C_s, F_s)
52:
           R_i \leftarrow \text{RansRenorm}(R_i)
53:
        end for
54:
55: end procedure
```

#### rANS order-1

43:

As described above, the decode logic is very similar to rANS Order-0 except we have a two dimensional array of frequencies to read and the decode uses the last character as the context for decoding the next one. In the pseudocode we illustrate this by using two dimensional vectors  $C_{i,j}$  and  $F_{i,j}$ . For simplicity, we reuse the Order-0 code by referring to  $C_i$  and  $F_i$  of the 2D vectors to get a single dimensional vector that operates in the same manner as the Order-0 code. This is not necessarily the most efficient implementation.

Note the code for dealing with the remaining bytes when an output buffer is not an exact multiple of 4 is less elegant in the Order-1 code. This is correct, but it is unfortunately a design oversight.

```
(Reads a table of Order-1 symbol frequencies F_{i,j})
    (and sets the cumulative frequency table C_{i,j+1} = C_{i,j} + F_{i,j})
 1: procedure READFREQUENCIES 1(F, C)
        sym \leftarrow \text{ReadUint8}
                                                                                                             ▶ Next alphabet symbol
 2:
 3:
        last \ sym \leftarrow sym
        rle \leftarrow 0
 4:
 5:
        repeat
 6:
             READFREQUENCIES 0(F_i, C_i)
             if rle > 0 then
 7:
                 rle \leftarrow rle - 1
 8:
                 sym \leftarrow sym + 1
 9:
10:
             else
11:
                 sym \leftarrow \text{ReadUint8}
                 if sym = last \ sym + 1 then
12:
                     rle \leftarrow \text{ReadUint8}
13:
                 end if
14:
             end if
15:
16:
             last\_sym \leftarrow sym
        until sym = 0
17:
    end procedure
19: procedure RANSDECODE1(output, nbytes)
        READFREQUENCIES 1(F, C)
20:
21:
        for j \leftarrow 0 to 3 do
                                                                                                  \triangleright Initialise 4 interleaved streams
             R_j \leftarrow \text{ReadUint}32
                                                                                                     ▷ Unsigned 32-bit little endian
22:
             L_j \leftarrow 0
                                                                                                                         ▷ Last symbol
23:
        end for
24:
25:
        i \leftarrow 0
26:
        while i < |nbytes/4| do
             for j \leftarrow 0 to 3 do
27:
                 f \leftarrow \text{RansGetCumulativeFreq}(R_i)
28:
                 s \leftarrow \text{RansGetSymbolFromFreq}(C_{L_i}, f)
30:
                 output_{i+j \times \lfloor nbytes/4 \rfloor} \leftarrow s
                 R_j \leftarrow \text{RANSADVANCESTEP}(R_j, C_{L_j,s}, F_{L_j,s})
31:
                 R_j \leftarrow \text{RansRenorm}(R_j)
32:
                 L_j \leftarrow s
33:
             end for
34:
             i \leftarrow i + 1
35:
36:
        end while
        (Now deal with the remainder if buffer size is not a multiple of 4,)
        (using rANS state 3 exclusively.)
        for i \leftarrow i \times 4 to len - 1 do
37:
             f \leftarrow \text{RansGetCumulativeFreq}(R_3)
38:
             s \leftarrow \text{RansGetSymbolFromFreq}(C_{L_3}, f)
39:
             output_i \leftarrow s
40:
             R_3 \leftarrow \text{RANSADVANCESTEP}(R_3, C_{L_3,s}, F_{L_3,s})
41:
             R_3 \leftarrow \text{RansRenorm}(R_3)
42:
             L_3 \leftarrow s
```

44: end for45: end procedure

### 3 rANS Nx16

CRAM version 3.1 defines an additional rANS entropy encoder, using 16-bit renormalisation instead of the 8-bit used in CRAM 3.0 and with inbuilt bit-packing and run-length encoding. The lower-bound and initial encoder state L is also changed to 0x8000. The Order-1 rANS Nx16 encoder has also been modified to permit a maximum frequency of 1024 instead of 4096. This offers better cache performance for the large Order-1 tables and usually has minimal impact on compression ratio.

Additionally it permits adjustment of the number of interleaved rANS states from the fixed 4 used in rANS 4x8 to either 4 or 32 states. The benefit of the 32-way interleaving is in enabling efficient use of SIMD instructions for faster encoding and decoding speeds. However it has a small cost in size and initialisation times so it is not recommended on smaller blocks of data.

Frequencies are now stored using uint7 format instead of ITF8. The tables are also stored differently, separating the list of symbols present in the alphabet (those with frequency greater than zero) from the frequencies themselves.

Finally transformations may be applied to the data prior to compression (or after decompression). These consist of stripe, for structured data where every Nth byte is sent to one of N separate compression streams, Run Length Encoding replacing repeated strings of symbols with a symbol and count, and bit-packing where reduced alphabets can combine multiple symbols into a byte prior to entropy encoding.

The initial "Order" byte is expanded with additional bits to list the transformations to be applied. The specifics of each sub-format are listed below, in the order they are applied.

- STRIPE: rANS Nx16 with multi-way interleaving (see Section 3.6).
- **NoSize**: Do not store the size of the uncompressed data stream. This information is not required when the data stream is one of the four sub-streams in the STRIPE format.
- CAT: If present, the order bit flag is ignored.

The uncompressed data stream is the same as the compressed stream. This is useful for very short data where the overheads of compressing are too high.

- N32: Flag indicating whether to interleave 4 or 32 rANS states.
- ORDER: Bit field defining order-0 (unset) or order-1 (set) entropy encoding, as described above by the RANSDECODENX16 0 and RANSDECODENX16 1 functions.
- **RLE**: Bit field defining whether Run Length Encoding has been applied to the data. If set, the reverse transorm will be applied using DecoderLe after Order-0 or Order-1 uncompression (see Section 3.4).
- PACK: Bit field indicating the data was packed prior to compression (see Section 3.5). If set, unpack the bits after any RLE decoding has been applied (if required) using the DECODEPACK function.

#### 3.1 Frequency tables

Frequency tables in rANS Nx16 separate the list of symbols from their frequencies. The symbol list must be stored in ascending ASCII order, with their frequency values in the same ordering as their corresponding symbols. For the Order-1 frequency table this list of symbols is those used in any context, thus we only have one alphabet recorded for all contexts. This means in some contexts some (potentially many) symbols will have zero frequency. To reduce the Order-1 table size an additional zero run-length encoding step is used. Finally the Order-1 frequencies may optionally be compressed using the Order-0 rANS Nx16 codec.

Frequencies must always add up to a power of 2, but do not necessarily have to match the final power of two used in the Order-0 (4096) and Order-1 (1024, 4096) entropy decoder algorithm. A normalisation step is applied after reading the frequencies to scale them appropriately. This is required as the Order-1 frequencies may be scaled differently for each context.

```
(Reads a set of symbols A used in our alphabet)
 1: function ReadAlphabet
        s \leftarrow \text{ReadUint8}
        last\_sym \leftarrow s
 3:
        rle \leftarrow 0
 4:
        repeat
 5:
 6:
            A \leftarrow (A, s)
                                                                                             \triangleright Append s to the symbol set A
            if rle > 0 then
 7:
                rle \, \leftarrow rle - 1
 8:
                s \leftarrow s+1
9:
            else
10:
                s \leftarrow \text{ReadUint8}
11:
12:
                if s = last \ sym + 1 then
                    rle \leftarrow \text{ReadUint8}
13:
                end if
14:
            end if
15:
16:
            last \quad sym \leftarrow s
17:
        until s = 0
        return A
18:
19: end function
    (Reads a table of Order-0 symbol frequencies F_i)
    (and sets the cumulative frequency table C_{i+1} = C_i + F_i)
 1: procedure READFREQUENCIESNX16 0(F, C)
        F \leftarrow (0, \ldots)
                                                                                      \triangleright (Set to zero for all i \in \{0, 1, ..., 255\})
        A \leftarrow \text{ReadAlphabet}
 3:
        foreach i in A do
 4:
            F_i \leftarrow \text{READUINT7}
 5:
        end foreach
 6:
 7:
        NormaliseFrequenciesNx16 0(F, 12)
 8:
9:
10:
        C_0 \leftarrow 0
        for s \leftarrow 0 to 255 do
                                                                                                 ▷ All 256 possible byte values
11:
            C_{s+1} \leftarrow C_s + F_s
12:
        end for
13:
14: end procedure
    (Normalises a table of frequencies F_i to sum to a specified power of 2.)
 1: procedure NormaliseFrequenciesNx16 0(F, bits)
        tot \leftarrow 0
        for i \leftarrow 0 to 255 do
 3:
            tot \leftarrow tot + F_i
 4:
        end for
 5:
        if tot = 0 or tot = (1 \ll bits) then
 6:
            return
 7:
        end if
 8:
 9:
        shift \leftarrow 0
10:
        while tot < (1 \ll bits) do
11:
12:
            tot \leftarrow tot * 2
13:
            shift \leftarrow shift + 1
        end while
14:
15:
        for i \leftarrow 0 to 255 do
16:
17:
            F_i \leftarrow F_i \ll shift
        end for
18:
19: end procedure
```

The Order-1 frequencies also store the complete alphabet of observed symbols (ignoring context) followed by a table of frequencies for each symbol in the alphabet. Given many frequencies will be zero where a symbol is present in one context but not in others, all zero frequencies are followed by a run length to omit adjacent zeros.

The order-1 frequency table itself may still be quite large, so is optionally compressed using the order-0 rANS Nx16 codec with a fixed 4-way interleaving. This is specified in the bottom bit of the first byte. If this is 1, it is followed by 7-bit encoded uncompressed and compressed lengths and then the compressed frequency data. The pseudocode here differs slightly to elsewhere as it indicates the input sources, which are either the uncompressed frequency buffer or the default (unspecified) source. The top 4 bits of the first byte indicate the number of bits used for the frequency tables. Permitted values are 10 and 12.

```
(Reads a table of Order-1 symbol frequencies F_{i,j})
    (and sets the cumulative frequency table C_{i,j+1} = C_{i,j} + F_{i,j})
 1: procedure ReadFrequenciesNx16 1(F, C, bits)
        comp \leftarrow \text{ReadUint8}
 2:
 3:
        bits \leftarrow comp >> 4
 4:
        if (comp \text{ and } 1) \neq 0 \text{ then }
 5:
             u size \leftarrow \text{ReadUint7}
                                                                                                                  ▶ Uncompressed size
 6:
             c size \leftarrow \text{ReadUint7}
                                                                                                                     ▷ Compressed size
             c \ data \leftarrow \text{ReadData}(c \ size)
 7:
             source \leftarrow RansDecodeNx16 \quad 0(c \quad data, 4)
                                                                                 \triangleright Create u size bytes of source from c data
 8:
 9:
             (define source to be the default input stream)
10:
11:
        end if
         F \leftarrow ((0, ...), ...)
                                                                                   \triangleright (Set to zero for all i and j \in \{0, 1, ..., 255\})
12:
         A \leftarrow \text{ReadAlphabet(from } source)
13:
        foreach i in A do
14:
             run \leftarrow 0
15:
             foreach j in A do
16:
                 if run > 0 then
17:
                     run \leftarrow run - 1
                                                                                                     \triangleright F_{i,j} is implicitly zero already
18:
                 else
19:
                     F_{i,j} \leftarrow \text{READUINT7}(\text{from } source)
20:
                     if F_{i,j} = 0 then
21:
                          run \leftarrow \text{ReadUint8}(\text{from } source)
22:
                     end if
23:
                 end if
24:
25:
             end foreach
26:
             NORMALISEFREQUENCIESNX16 0(F_i, bits)
27:
             C_{i,0} \leftarrow 0
28:
             for j \leftarrow 0 to 255 do
29:
                 C_{i,j+1} \leftarrow C_{i,j} + F_{i,j}
30:
             end for
31:
         end foreach
32:
33: end procedure
```

#### 3.2 rANS Nx16 Order-0

To decode an Order-0 encoded byte stream we first decode the symbol frequencies as described above and then decode the N interleaved rANS states. This is similar to the old (4x8) rANS decoder, but the RANSRENORM function is replaced by a single 16-bit renormalisation instead of a loop using 8-bit values and can interleave to different amounts.

```
1: function RansGetCumulativeFreqNx16(R, bits)
2: return R AND ((1 << bits) - 1)
3: end function
```

```
4: function RansAdvanceStepNx16(R, c, f, bits)
       return f \times (R \gg bits) + (R \text{ AND } ((1 \ll bits) - 1) - c
6: end function
7: function RansRenormNx16(R)
       if R < (1 << 15) then
8:
9:
           R \leftarrow (R << 16) + \text{ReadUint16}
       end if
10:
       return R
12: end function
13: function RANSDECODENX16 0(len, N)
       READFREQUENCIESNX16 0(F, C)
       for j \leftarrow 0 to N-1 do
15:
           R_j \leftarrow \text{ReadUint}32
16:
17:
       end for
18:
       for i \leftarrow 0 to len - 1 do
           j \leftarrow i \bmod N
19:
           f \leftarrow \text{RansGetCumulativeFreqNx16}(R_i, 12)
20:
           s \leftarrow \text{RansGetSymbolFromFreq}(C, f)
21:
           R_j \leftarrow \text{RANSADVANCESTEPNX16}(R_j, C_s, F_s, 12)
23:
           R_j \leftarrow \text{RansRenormNx16}(R_j)
24:
       end for
25:
26:
       return out
27: end function
```

#### 3.3 rANS Nx16 Order-1

The Order-1 code is comparable to Order-0 but with an extra dimension (the previous value) to the F and C matrices and a more complex system for storing the frequencies. The frequencies may also add up to either 1024 or 4096 (10 or 12 bits).

The N rANS states don't operate on interleaved data either, but in distinct regions so they can utilise their previous symbols without inter-dependency between the decoded output of the rANS states. This makes the handling of data that isn't a multiple of N is a little more complex too.

```
1: function RansDecodeNx16 1(len, N)
        ReadFrequenciesNx16 1(F, C, bits)
        for j \leftarrow 0 to N-1 do
 3:
             R_j \leftarrow \text{ReadUint}32
 4:
             L_j \leftarrow 0
                                                                                                                        ▶ Last symbol
 5:
        end for
 6:
    (The primary unrollable loop)
        for i \leftarrow 0 to \lfloor len/N \rfloor - 1 do
 7:
             for j \leftarrow 0 to N-1 do
 8:
                 f \leftarrow \text{RansGetCumulativeFreqNx16}(R_i, bits)
 9:
                 s \leftarrow \text{RansGetSymbolFromFreq}(C_{L_i}, f)
10:
11:
                 out_{i+j \times \lfloor len/N \rfloor} \leftarrow s
                 R_j \leftarrow \text{RANSADVANCESTEPNX16}(R_j, C_{L_j,s}, F_{L_j,s}, bits)
12:
                 R_j \leftarrow \text{RansRenormNx16}(R_j)
13:
                 L_j \leftarrow s
14:
             end for
15:
        end for
16:
    (The remainder for data not a multiple of N in size, using R_{N-1} throughout.)
        for i \leftarrow i \times N to len - 1 do
17:
             f \leftarrow \text{RansGetCumulativeFreqNx16}(R_{N-1}, bits)
18:
             s \leftarrow \text{RansGetSymbolFromFreq}(C_{L_{N-1}}, f)
19:
             out_i \leftarrow s
20:
```

```
R_{N-1} \leftarrow \text{RANSADVANCESTEPNX16}(R_{N-1}, C_{L_{N-1},s}, F_{L_{N-1},s}, bits)
21:
             R_{N-1} \leftarrow \text{RANSRENORMNx16}(R_{N-1})
22:
             L_{N-1} \leftarrow s
23:
         end for
24:
        return out
25:
26: end function
```

#### 3.4 rANS Nx16 Run Length Encoding

For symbols that occur many times in succession, we can replace them with a single symbol and a count. In this specification, run lengths are always provided for certain symbols (even if the run length is 1) and never for the other symbols (even if many are consecutive).

The data stream is split into two parts: the meta-data holding run-lengths and the run-removed data itself.

Bytes	$\mathbf{Type}$	Name	Description
?	uint7	$rle\_meta\_len$	RLE meta-data-size times 2. The bottom bit is a flag to
			indicate whether $rle\_meta$ is uncompressed (1) or com-
			pressed $(0)$ .
?	uint7	$rle\_len$	Size of uncompressed data before Decoderate is applied
?	uint7	$(comp\_meta\_len)$	Only stored if bottom bit of $rle\_meta\_len$ is unset. Size
			of compressed RLE meta data.
?	uint8[]	$rle\_meta$	RLE meta-data. Decompress with RANSDECODENX16_0
		_	if bottom bit of $rle\_meta\_len$ is unset.

The meta-data format starts with the count of symbols which have runs associated with them (zero being interpreted as all of them) and the list of these symbol values. This is followed by the run lengths encoded as variable sized integers in the *uint7* format.

```
(Reads and optionally uncompresses the blob of run-lengths and the array L)
```

```
(indicating which symbols have associates run-lengths.)
1: function DecodeRLEMeta(N)
       L \leftarrow (0, \ldots)
                                                                                \triangleright (Set to zero for all i \in \{0, 1, ..., 255\})
2:
       rle meta len \leftarrow ReadUint7
3:
       len \leftarrow ReadUint7
                                                              ▶ Length of uncompressed O0/O1 data, pre-expansion
4:
       if rle meta len AND 1 then
5:
           rle meta \leftarrow ReadData(|rle meta len/2|)
6:
7:
       else
           comp meta len \leftarrow ReadUint7
8:
           rle meta \leftarrow ReadData(comp meta len)
9:
           rle meta \leftarrow RansDecodeNx16 0 (rle meta len/2, N, source = rle meta, source = rle meta)
10:
       end if
11:
       n \leftarrow \text{ReadUint8}(metadata)
12:
       if n = 0 then
13:
           n \leftarrow 256
14:
       end if
15:
       for i \leftarrow 0 to n-1 do
16:
           s \leftarrow \text{ReadUint8}(metadata)
17:
           L_s \leftarrow 1
18:
       end for
19:
       return (L, rle meta, len)
20:
21: end function
```

The use of the run length meta-data occurs when expanding the uncompressed data, after Order-0 or Order-1 data decompression.

```
(Expands data (in) using run-length metadata)
1: function DecodeRLE(in, L, metadata, in len)
```

```
2:
         j \leftarrow 0
         for i \leftarrow 0 to in len - 1 do
 3:
              sym \leftarrow \text{ReadUint8}(in)
 4:
              if L_s then
 5:
                  run \leftarrow \text{ReadUint7}(metadata)
 6:
                  for k \leftarrow 0 to run do
 7:
 8:
                       out_{i+k} \leftarrow s
                  end for
 9:
10:
                  j \leftarrow j + run + 1
              else
11:
12.
                  out_j \leftarrow s
                  j \leftarrow j + 1
13:
              end if
14:
         end for
15:
         return out
16:
17: end function
```

### 3.5 rANS Nx16 Bit Packing

If the alphabet of used symbols in the uncompressed data stream is small - no more than 16 - then we can pack multiple symbols together to form bytes prior to compression. This permits 2, 4, 8 and infinite (all symbols are the same) numbers per byte. The distinct symbol values do not need to be adjacent as a mapping table P converts mapped value x to original symbol  $P_x$ .

The packed format is split into uncompressed meta-data (below) and the compressed packed data.

$\mathbf{Bytes}$	$\mathbf{Type}$	$\mathbf{Name}$	Description
1	byte	nsym	Number of distinct symbols
nsym	byte[]	P	Symbol map
?	uint7	len	Length of packed data

The first meta-data byte holds nsym, the number of distinct values, followed by nsym bytes to construct the P map. If nsym=1 then the byte stream is a stream of constant values and no bit-packing is done (we know every value already). If nsym=2 then each symbol is 1 bit (8 per byte), if  $2 < nsym \le 4$  symbols are 2 bits each (4 per byte) and if  $4 < nsym \le 16$  symbols are 4 bits each (2 per byte). It is not permitted to have nsym > 16 or nsym=0 as bit packing is not possible. Bits are unpacked from low to high.

Decoding this meta-data is implemented by the DECODEPACKMETA function below.

```
1: function DECODEPACKMETA

2: nsym \leftarrow READUINT8

3: for i \leftarrow 0 to nsym - 1 do

4: P_i \leftarrow READUINT8

5: end for

6: len \leftarrow READUINT7

7: return (P, nsym, len)

8: end function
```

After uncompressing the main data stream, it should be unpacked using DECODEPACK below. The format of this data stream is packed data as described above.

```
1: function DecodePack(data, P, nsym, len)
2:
       j \leftarrow 0
                                                                                  \triangleright Index into data; i is index into output
3:
       if nsym \leq 1 then
                                                                                                              ▷ Constant value
           for i \leftarrow 0 to len - 1 do
4:
               out_i \leftarrow P_0
5:
           end for
6:
       else if nsym \leq 2 then
                                                                                                              ▷ 1 bit per value
7:
           for i \leftarrow 0 to len - 1 do
8:
               if i \mod 8 = 0 then
9:
```

```
v \leftarrow data_i
10:
                       j \leftarrow j + 1
11:
                   end if
12:
                   out_i \leftarrow P_{(v \text{ AND } 1)}
13:
                   v = v >> 1
14:
              end for
15:
         else if nsym \leq 4 then
                                                                                                                               \triangleright 2 bits per value
16:
              for i \leftarrow 0 to len - 1 do
17:
                   if i \mod 4 = 0 then
18:
                       v \leftarrow data_i
19:
                       j \leftarrow j + 1
20:
                   end if
21:
22:
                   out_i \leftarrow P_{(v \text{ AND } 3)}
                   v = v \gg 2
23:
              end for
24:
         else if nsym \le 16 then
                                                                                                                               ▶ 4 bits per value
25:
              for i \leftarrow 0 to len - 1 do
26:
                   if i \mod 2 = 0 then
27:
                       v \leftarrow data_i
28:
29:
                       j \leftarrow j + 1
                  end if
30:
                  out_i \leftarrow P_{(v \text{ AND } 15)}
31:
32:
                   v = v >> 4
              end for
33:
34:
         else
              Error
35:
36:
         end if
37:
         return out
38: end function
```

#### 3.6 Striped rANS Nx16

If we have a series of 32-bit values, we can often get better compression by treating it as a series of 4 8-bit values representing the first to last bytes in each 32-bit word, than we can by simply processing it as a stream of 8-bit values. Each 4th byte is sent to its own stream producing 4 interleaved streams, so the  $1^{st}$  stream will hold data from byte 0, 4, 8, etc while the  $2^{nd}$  stream will hold data from byte 1, 5, 9, etc. Each of those four streams is then itself compressed using this compression format.

For example an input block of small unsigned 32-bit little-endian numbers may use RLE for the first three streams as they are mostly zero, and a non-RLE Order-0 entropy encoder for the last stream.

In the general case we describe this as N-way interleaved streams. We can consider this interleaving process to be equivalent to a table transpose of M rows by N columns to N rows by M columns, followed by compressing each N row independently.

The byte stream consists of a 7-bit encoded uncompressed combined length, a byte holding the value of N, followed by N compressed lengths also 7-bit encoded. Finally the data sub-streams themselves, each a valid cdata stream, follow.

Normally our *cdata* format will include the decoded size, but with STRIPE we can omit this from the internal compressed sub-streams (using the NoSize flag) as given the total length we know how to compute the sublengths.

Reproducing the original uncompressed data involves decoding the N sub-streams and interleaving them together again (reversing the table transpose). The uncompressed data length may not necessary be an exact multiple of N, in which case the latter uncompressed sub-streams may be 1 byte shorter.

As an example starting with input data D we define the transposed data T as:

```
D = aA\underline{A}bB\underline{B}cC\underline{C}dD\underline{D}e
T = [abcde, ABCD, \underline{ABCD}]
```

Note our example data is not a multiple of N long, missing  $E\underline{E}$ , which gives T fragments of length [5, 4, 4].

If  $D_i$  is the  $i^{th}$  character in D and  $T_{j,i}$  is the  $i^{th}$  character of the  $j^{th}$  substring in T, transformations between D and T are defined as:

```
T_{j,i} = D_{iN+j}
         D_i = T_{(i \bmod N), (i \bmod N)}
 1: function RANSDECODESTRIPE(len)
         N \leftarrow \text{ReadUint8}
         for j \leftarrow 0 to N do
                                                                                                            ▶ Fetch N compressed lengths
 3:
              clen_j \leftarrow ReadUint7
 4:
         end for
         for j \leftarrow 0 to N do
                                                                                                                          \triangleright Decode N streams
 6:
              ulen_j \leftarrow (len \operatorname{div} N) + ((len \operatorname{mod} N) > j)
                                                                                      \triangleright (x > y) expression being 1 if true, 0 if false
 7:
              T_j \leftarrow \text{RANSDECODENX16}(ulen_j)
 8:
 9:
         for j \leftarrow 0 to N-1 do
                                                                                                                                          ▷ Stripe
10:
              for i \leftarrow 0 to ulen_i - 1 do
11:
                  out_{i \times N+j} \leftarrow T_{j,i}
12:
              end for
13:
14:
         end for
         {f return}\ out
15:
```

### 3.7 Combined rANS Nx16 Format

16: end function

We combine the Order-0 and Order-1 rANS Nx16 encoder with optional run-length encoding, bit-packing and four-way interleaving into a single data stream.

Bits	Type	Name	Description	
8	uint8	flag	Data format bit field	
Unless	s NoSize	flag is set:		
?	uint7	ulen	Uncompressed length	
If ST	RIPE flag	is set:		
8	uint8	N	Number of sub-streams	
?	uint7[]	clen[]	N copies of compressed sub-block length	
?	uint8[]	cdata[]	N copies of Compressed data sub-block (recurse)	
If CA	T flag is	set (and Stri	PE flag is unset):	
?	uint8[]	udata	Uncompressed data stream	
If Pa	CK flag is	set (and neith	her Stripe or Cat flags are set):	
?	uint8[]	pack_meta	Pack lookup table	
If RLE flag is set (and neither Stripe or Cat flags are set):				
?	uint8[]	rle_meta	RLE meta-data	
If neither Stripe or Cat flags are set:				
?	uint8[]	cdata	Entropy encoded data stream (see Order flag)	

The first byte of our generalised data stream is a bit-flag detailing the type of transformations and entropy

encoders to be combined, followed by optional meta-data, followed by the actual compressed data stream. The bit-flags are defined below, but note not all combinations are permitted.

Bit AND value	$\mathbf{Code}$	Description
1	Order	Order-0 or Order-1 entropy coding
2	reserved	Reserved (for possible order-2/3)
4	N32	Interleave $N = 32$ rANS states (else $N = 4$ )
8	$Stripe^*$	multi-way interleaving of byte streams
16	NoSize	original size is not recorded (for use by Stripe)
32	Cat	Data is uncompressed
64	RLE	Run length encoding, with runs and literals encoded separately
128	Pack	Pack 2, 4, 8 or infinite symbols per byte

<sup>(\*)</sup> Not to be used in conjunction with other bit-field values except NoSize.

Bit-packing and run length encoding transforms have their own meta-data, which is decoded prior to the main compressed data stream. After decoding, these transforms are applied in order of RLE followed by unpack as required and in that order.

For example a *flag* data-format value of 197 indicates a byte stream should decode the pack meta-data, the RLE meta-data and the Order-1 compressed data itself, all using 32 rANS states, and then apply the RLE followed by Unpack transforms to yield the original uncompressed data.

```
RANSDECODENX16 describes the decoding of the generalised RANS Nx16 decoder.
 1: function RANSDECODENX16(len)
        flags \leftarrow ReadUint8
       if flagsAND NoSize \neq 0 then
 3:
 4:
           len \leftarrow ReadUint7
       end if
 5:
 6:
       if flagsAND STRIPE then
           data \leftarrow RansDecodeStripe(len)
 7:
           {f return}\ data
 8:
       end if
 9:
10:
       if flagsAND N32 then
           N \leftarrow 32
11:
       else
12:
           N \leftarrow 4
13:
14:
       end if
                                                                                                   ⊳ Read meta-data
       if flags AND PACK then
15:
           pack len \leftarrow len
16:
           (P, nsym, len) \leftarrow DECODEPACKMETA
17:
18:
       end if
       if flagsAND RLE then
19:
           rle len \leftarrow len
20:
           (L, rle\ meta, len) \leftarrow DECODERLEMETA(N)
21:
22:
       end if
                                                                                     ▶ Uncompress main data block
23:
       if flagsAND CAT then
           data \leftarrow READDATA(len)
24:
25:
       else if flagsAND Order then
           data \leftarrow RansDecodeNx16 \quad 1(len, N)
26:
27:
           data \leftarrow RANSDECODENX16 \quad 0(len, N)
28:
29:
       end if
                                                                                      ▶ Apply data transformations
       if flagsAND RLE then
30:
           data \leftarrow \text{DECODERLE}(data, L, rle meta, rle len)
31:
32:
       if flags AND PACK then
33:
           data \leftarrow \text{DECODEPack}(data, P, nsym, pack len)
34:
```

35: end if
 36: return data
 37: end function

## 4 Range coding

The range coder is a byte-wise arithmetic coder that operates by repeatedly reducing a probability range (for example 0.0 to 1.0) one symbol (byte) at a time, with the complete compressed data being represented by any value within the final range.

This is easiest demonstrated with a worked example, so let us imagine we have an alphabet of 4 symbols, 't', 'c', 'g', and 'a' with probabilities 0.2, 0.3, 0.3 and 0.2 respectively. We can construct a cumulative distribution table and apply probability ranges to each of the symbols:

$\mathbf{Symbol}$	Probability	Range low	Range high
t	0.2	0.0	0.2
$^{\mathrm{c}}$	0.3	0.2	0.5
g	0.3	0.5	0.8
$\mathbf{a}$	0.2	0.8	1.0

As a *conceptual example* (note: this is not how it is implemented in practice, see below) using arbitrary precision floating point mathematics this could operate as follows.

If we wish to encode a message, such as "cat" then we will encode one symbol at a time ('c', 'a', 't') successively reducing the initial range of 0.0 to 1.0 by the cumulative distribution for that symbol. At each point the new range is adjusted to be the proportion of the previous range covered by the cumulative symbol range. See the table footnotes below for the worked mathematics.

Range low	/ high	Symbol	Sym. low	/ high	New range low	New range high
0.000	1.000	c	0.2	0.5	$0 + (1 - 0) \times .2$	$0 + (1 - 0) \times .5$
0.200	0.500	a	0.8	1.0	$.2 + (.52) \times .8$	$.2 + (.52) \times 1$
0.440	0.500	t	0.0	0.2	$.44 + (.544) \times 0$	$.44 + (.544) \times .2$
0.440	0.452	<end $>$				

Our final range is 0.44 to 0.452 with any value in that range representing "cat", thus 0.45 would suffice. A pictorial example of this process is below.

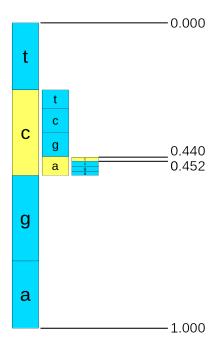


Figure 1: A pictorial demonstration of range reduction.

Decoding is simply the reverse of this. In the above picture we can see that 0.45 would read off 'c', 'a' and 't' by repeatedly comparing the symbol ranges to the current range and using those to identify the symbol and produce a new range.

Range low	Range high	Fraction into range	Symbol
0.000	1.000	0.450	c
0.200	0.500	$0.833^{a}$	a
$0.440^{\mathbf{b}}$	0.500	0.167	$\mathbf{t}$

```
a. 0.45 into range 0.2 to 0.5: (0.45 - 0.2)/(0.5 - 0.2) = 0.833. This falls within the 0.8 to 1.0 symbol range for 'a'. b. 'a' symbol range 0.8 to 1.0 applied to range 0.2 to 0.5: 0.2 + 0.8 \times (0.5 - 0.2) = 0.44 and 0.2 + 1.0 \times (0.5 - 0.2) = 0.5.
```

Note: The above example is not how the actual implementation works<sup>6</sup>. For efficiency, we use integer values having a starting range of 0 to  $2^{32} - 1$ . We write out the top 8-bits of the range when low and high become the same value. Special care needs to be taken to handle small values that are numerically close but stradding a top byte value, such as 0x37ffba20 to 0x38000034. The decoder does not need to do anything special here, but the encoder must track the number of 0xff or 0x00 values to emit in order to avoid needing arbitrary precision integers.

Pseudocode for the range codec decoding follows. This implementation uses code (next few bytes in the current bit-stream) and range instead of low and high, both 32-bit unsigned integers. This specification focuses on decoding, but given the additional complexity of the precision overflows in encoder we describe this implementation too.

RANGEDECODECREATE initialises the range coder, reading the first bytes of the compressed data stream.

```
1: function RANGEDECODECREATE
      range \leftarrow 2^{32} - 1
                                                                                      ▶ Maximum 32-bit unsigned value
      code \leftarrow 0
3:
                                                                                                          ▷ 32-bit unsigned
      for i \leftarrow 0 to 4 do
4:
          code \leftarrow (code << 8) + ReadUint8
5:
      end for
6:
      code \leftarrow code \text{ AND } 2^{32} - 1
7:
      return this range coder (range, code)
9: end function
```

Decoding each symbol is in two parts; getting the current frequency and updating the range.

```
1: function RANGEGETFREQ(tot\ freq)
      range \leftarrow range \text{ div } tot \text{ } freq
      return code div range
3:
4: end function
1: procedure RANGEDECODE(sym\ low,\ sym\ freq,\ tot\ freq)
      code \leftarrow code - sym \ low \times range
      range \leftarrow range \times sym \ freq
3:
      while range < 2^{24} do
                                                                                                         ▷ Renormalise
4:
          range \leftarrow range << 8
5:
6:
          code \leftarrow (code << 8) + ReadUint8
      end while
7:
8: end procedure
```

As mentioned above, the encoder is more complex as it cannot shift out the top byte until it has determined the value. This can take a considerable while if our current low / high (low + range) are very close but span a byte boundary, such as 0x37ffba20 to 0x38000034, where ultimately we will later emit either 0x37 or 0x38. To handle this case, when the range gets too small but the top bytes still differ, the encoder caches the top byte of low (0x37) and keeps track of how many 0xff or 0x00 values will need to be written out once we finally observe which value the range has shrunk to.

The RANGEENCODE function is a straight forward reversal of the RANGEDECODE, with the exception of the special code for shifting the top byte out of the *low* variable.

```
1: procedure RANGEENCODE(sym low, sym freq, tot freq)
```

 $<sup>^6\</sup>mathrm{This}$  implementation was designed by Eugene Shelwein, based on Michael Schindler's earlier work.

```
old\ low\ \leftarrow low
                   \leftarrow range \operatorname{div} tot\_freq
 3:
        range
        low
                    \leftarrow low + sym\_low \times range
 4:
        range
                   \leftarrow range \times sym \ freq
 5:
        if low < old low then
 6:
 7:
            carry \leftarrow 1
                                                                                                                          ▷ overflow
        end if
 8:
        while range < 2^{24} do
                                                                                                                     ▷ Renormalise
 9:
            range \leftarrow range << 8
10:
            RANGESHIFTLOW
11:
        end while
12:
13: end procedure
```

RANGESHIFTLOW is the main heart of the encoder renormalisation. It tracks the total number of extra bytes to emit and *carry* indicates whether they are a string of 0xFF or 0x00 values.

```
1: procedure RangeShiftLow
       if low < 0xff000000 or carry \neq 0 then
           if carry = 0 then
 3:
               WRITEBYTE(cache)
                                                                                          \triangleright top byte cache plus FFs
 4:
 5:
               while FFnum > 0 do
                  WriteByte(0xff)
 6:
                  FFnum \leftarrow FFnum - 1
 7:
               end while
 8:
           else
 9:
               WRITEBYTE(cache + 1)
                                                                                       \triangleright top byte cache + 1 plus 00s
10:
               while FFnum > 0 do
11:
                  WRITEBYTE(0)
12:
                  FFnum \leftarrow FFnum - 1
13:
               end while
14:
           end if
15:
16:
           cache \leftarrow low >> 24
                                                                            ▷ Copy of top byte ready for next flush
           carry \leftarrow 0
17:
       else
18:
           FFnum \leftarrow FFnum + 1
19:
20:
       end if
       low \leftarrow low \ll 8
21:
22: end procedure
```

For completeness, the Encoder initialisation and finish functions are below.

```
1: procedure RangeEncodeStart
      low
                \leftarrow 0
      range \leftarrow 2^{32} - 1
3:
      FFnum \leftarrow 0
4:
      carry
5:
      cache \quad \leftarrow 0
7: end procedure
1: procedure RangeEncodeEnd
      for i \leftarrow 0 to 4 do
                                                                                      \triangleright Flush any residual state in low
          RANGESHIFTLOW
3:
      end for
4:
5: end procedure
```

#### 4.1 Adaptive Modelling

The probabilities passed to the range coder may be fixed for all scenarios (as we had in the "cat" example), or they may be adaptive and context aware. For example the letter 'u' occurs around 3% of time in English text,

but if the previous letter was 'q' it is close to 100% and if the previous letter was 'u' it is close to 0%. Using the previous letter is known as an Order-1 entropy encoder, but the context can be anything. We can also adaptively adjust our probabilities as we encode or decode, learning the likelihoods and thus avoiding needing to store frequency tables in the data stream covering all possible contexts.

To do this we use a statistical model, containing an array of symbols S and their frequencies F. The sum of these frequences must be less than  $2^{16} - 16$  so after adjusting the frequencies it never go above the maximum unsigned 16-bit integer. When they get too high, they are renormalised by approximately halving the frequencies (ensuring none drop to zero).

Typically an array of models are used where the array index represents the current context.

To encode any symbol the entropy encoder needs to know the frequency of the symbol to encode, the cumulative frequencies of all symbols prior to this symbol, and the total of all frequencies. For decoding a cumulative frequency is obtained given the frequency total and the appropriate symbol is found matching this frequency. Symbol frequencies are updated after each encode or decode call and the symbols are kept in order of most-frequent symbol first in order to reduce the overhead of scanning through the cumulative frequencies.

MODELCREATE initialises a model by setting every symbol to have a frequency of 1. (At no point do we permit any symbol to have zero frequency.)

```
1: function MODELCREATE(num sym)
      total freq \leftarrow num sym
2:
3:
      max \quad sym \leftarrow num \quad sym - 1
      for i \leftarrow 0 to max\_sym do
4:
          S_i \leftarrow i
5:
          F_i \leftarrow 1
6:
7:
      end for
      return this model (total freq, max sym, S, F)
8:
  end function
```

MODELDECODE is called once for each decoded symbol. It returns the next symbol and updates the model frequencies automatically.

```
1: function MODELDECODE(rc)
       freq \leftarrow rc. RangeGetFrequency(total freq)
2:
       x \leftarrow 0
3:
4:
       acc \leftarrow 0
       while acc + F_x \leq freq do
5:
           acc \leftarrow acc + F_x
6:
           x \leftarrow x + 1
7:
       end while
8:
       rc.RangeDecode(acc, F_x, total\_freq)
9:
10:
       F_x \leftarrow F_x + 16
                                                                                              ▶ Update model frequencies
       total\_freq \leftarrow total\_freq + 16
11:
       if total freq > 2^{16} - 17 then
12:
           ModelRenormalise
13:
       end if
14:
       sym \leftarrow S_x
15:
       if x > 0 and F_x > F_{x-1} then
16:
           SWAP(F_x, F_{x-1})
17:
           SWAP(S_x, S_{x-1})
18:
19:
       end if
       return sym
20:
21: end function
```

MODELRENORMALISE is called whenever the total frequencies get too high. The frequencies are halved, taking sure to avoid any zero frequencies being created.

```
1: procedure MODELRENORMALISE

2: total\_freq \leftarrow 0

3: for i \leftarrow 0 to max\_sym do

4: F_i \leftarrow F_i - (F_i \text{ div } 2)

5: total freq \leftarrow total freq + F_i
```

```
6: end for
7: end procedure
```

#### 4.2 Order-0 and Order-1 Encoding

We can combine the model defined above and the range coder to provide a simple function to perform Order-0 entropy decoder.

```
1: function DecodeOrder0(len)
        max \quad sym \leftarrow \text{ReadUint8}
 3:
        if max \quad sym = 0 then
 4:
            max \quad sym \leftarrow 256
 5:
       model\ lit \leftarrow ModelCreate(max\ sym)
 6:
       rc \leftarrow \text{RangeDecodeCreate}
 7:
        for i \leftarrow 0 to len - 1 do
 8:
            out_i \leftarrow model \ lit.ModelDecode(rc)
 9:
10:
        end for
        return out
11:
12: end function
```

The Order-1 variant simply uses an array of models and selects the appropriate model based on the previous value encoded or decoded. This array index is our "context".

```
1: function DECODEORDER1(len)
        max \quad sym \leftarrow \text{ReadUint8}
        if max \quad sym = 0 then
 3:
 4:
            max \quad sym \leftarrow 256
        end if
 5:
        for i \leftarrow 0 to max \ sym - 1 do
 6:
            model \ lit_i \leftarrow ModelCreate(max \ sym)
 7:
        end for
 8:
 9:
        rc \leftarrow \text{RangeDecodeCreate}
        last \leftarrow 0
10:
        for i \leftarrow 0 to len - 1 do
11:
            out_i \leftarrow model \ lit_{last}.ModelDecode(rc)
12:
13:
            last \leftarrow out_i
14:
        end for
        return out
16: end function
```

### 4.3 RLE with Order-0 and Order-1 Encoding

The DECODEORDER0 and DECODEORDER1 codecs can be expanded to include a count of how many runs of each symbol should be decoded. Both order 0 and order 1 variants are possible.

After the symbol is decoded, the run length must be decoded to indicate how many extra copies of this symbol occur. Long runs are broken into a series of lengths of no more than 3. If length 3 is decoded it indicates we must decode an additional length and add to the current one. The context used for the run length model is the symbol itself for the initial run, 256 for the first continuation run (if  $\geq 4$ ) and 257 for any further continuation runs. Thus encoding 10 'A' characters would first store symbol 'A' followed by run length 3 (with context 'A'), length 3 (context 256), length 3 (context 257), and length 1 (context 257).

For example, if we have the string "ABBCCCCDDDDD" we will record "A" <0> "B" <1> "C" <3,0> and "D" <3,1>.

```
1: function DecoderLE0(len)

2: max\_sym \leftarrow ReadUint8

3: if max\_sym = 0 then

4: max\_sym \leftarrow 256
```

```
5:
        end if
        model\ lit \leftarrow ModelCreate(max\ sym)
 6:
        for i \leftarrow 0 to 257 do
 7:
             model \quad run_i \leftarrow ModelCreate(4)
 8:
        end for
 9:
        rc \leftarrow \text{RangeDecodeCreate}
10:
        i \leftarrow 0
11:
        while i < len do
12:
             out_i \leftarrow model\_lit.ModelDecode(rc)
13:
             part \leftarrow model\_run_{out_i}.ModelDecode(rc)
14:
            run \leftarrow part
15:
            rctx \leftarrow 256
16:
             while part = 3 do
17:
                 part \leftarrow model\_run_{rctx}.ModelDecode(rc)
18:
                 rctx \leftarrow 257
19:
20:
                 run \leftarrow run + part
21:
             end while
             for j \leftarrow 1 to run do
22:
23:
                 out_{i+j} \leftarrow out_i
             end for
24:
25:
             i \leftarrow run + 1
        end while
26:
        return out
27:
28: end function
```

The order-1 run length variant is identical to order-0 except the previous symbol is used as the context for the next literal. The context for the run length does not change.

```
1: function DECODERLE1(len)
 2:
        max \quad sym \leftarrow \text{ReadUint8}
        if max \quad sym = 0 then
 3:
 4:
             max \quad sym \leftarrow 256
        end if
 5:
        for i \leftarrow 0 to max \ sym - 1 do
 6:
             model \ lit_i \leftarrow ModelCreate(max \ sym)
 7:
 8:
        end for
 9:
        for i \leftarrow 0 to 257 do
             model\_run_i \leftarrow ModelCreate(4)
10:
11:
        rc \leftarrow \text{RangeDecodeCreate}
12:
        last \leftarrow 0
13:
        i \leftarrow 0
14:
         while i < len do
15:
             out_i \leftarrow model\_lit_{last}.ModelDecode(rc)
16:
             last \leftarrow out_i
17:
             part \leftarrow model \quad run_{last}.ModelDecode(rc)
18:
             run \leftarrow part
19:
             rctx \leftarrow 256
20:
             while part = 3 do
21:
                 part \leftarrow model \ run_{rctx}.ModelDecode(rc)
22:
                 rctx \leftarrow 257
23:
24:
                 run \leftarrow run + part
             end while
25:
             for j \leftarrow 1 to run do
26:
                 out_{i+j} \leftarrow last
27:
             end for
28:
             i \leftarrow run + 1
29:
```

30: end while 31: return out 32: end function

We wrap up the Order-0 and 1 entropy encoder, both with and without run length encoding, into a data stream that specifies the type of encoded data and also permits a number of additional transformations to be applied. These transformations support bit packing (for example a data block with only 4 distinct values can be packed with 4 values per byte), no-op for tiny data blocks where entropy encoding would grow the data and N-way interleaving of the 8-bit components of a 32-bit value.

Bits	Type	Name	Description		
8	uint8	flag	Data format bit field		
Unless	s NoSize	flag is set:			
?	uint7	ulen	Uncompressed length		
If STI	RIPE flag				
8	uint8	N	Number of sub-streams		
?	uint7[]	clen[]	N copies of compressed sub-block length		
?	uint8[]	cdata[]	N copies of Compressed data sub-block (recurse)		
If Ca	T flag is s	set (and Strif	PE flag is unset):		
?	uint8[]	uint8[] udata Uncompressed data stream			
If Pag	CK flag is	set (and neith	her Stripe or Cat flags are set):		
?	?   uint8[]   pack_meta   Pack lookup table				
If neit	ther Stri	PE $or$ Cat $fla$	gs are set:		
?	uint8[]	cdata	Entropy encoded data stream (see Order / RLE / Ext		
			flags)		

The first byte of our generalised data stream is a bit-flag detailing the type of transformations and entropy encoders to be combined, followed by optional meta-data, followed by the actual compressed data stream. The bit-flags are defined below, but note not all combinations are permitted.

Bit AND value	Code	Description	
1	Order*	Order-0 or Order-1 entropy coding	
2	reserved	Reserved (for possible order-2/3)	
4	Ext	"External" compression via bzip2	
8	$Stripe^{\dagger}$	N-way interleaving of byte streams	
16	NoSize	Original size is not recorded (used by Stripe)	
32	$\mathrm{Cat}^\dagger$	Data is uncompressed	
64	$\mathrm{RLE}^*$	Run length encoding, with runs and literals encoded separately	
128	Pack	Pack 2, 4, 8 or infinite symbols per byte	

- $(\ast)$  Has no effect when Ext flag is set.
- (†) Not to be used in conjunction with other flags except PACK and NoSize.

Of these STRIPE is the most complex. As with the rANS Nx16 encoder, the data is rearranged such that every  $N^{th}$  byte is adjacent in a single block producing N distinct sub-blocks. Each of the N streams is then itself compressed using this compression format.

For example an input block of small unsigned 32-bit little-endian numbers may use RLE for the first three streams as they are mostly zero, and a non-RLE Order-0 entropy encoder of the last stream. Normally our data format will include the decoded size, but with STRIPE we can omit this from the internal compressed streams as we know their size will be a computable fraction of the combined data.

The data layout differs for each of these bit types, as described below in the ARITHDECODE function. Some of these can be used in combination, so the order needs to be observed. The Pack format has additional meta data. This is decoded first, before entropy decoding and finally expanding the specified pack transformation after decompression. For example value 193 is indicates a byte stream should be decoded with an RLE aware order-1 entropy encoder and then unpacked.

#### 1: **function** ARITHDECODE(len)

```
2:
       flags \leftarrow ReadUint8
       if flags AND NoSize \neq 0 then
3:
           len \leftarrow ReadUint7
4:
       end if
5:
       if flags AND STRIPE then
6:
           data \leftarrow \text{DECODESTRIPE}(len)
7:
8:
           return data
       end if
9:
       if flags AND PACK then
10:
           pack len \leftarrow len
11:
           (P, nsym, len) \leftarrow DECODEPACKMETA
12:
       end if
13:
                                                                                                  if flags AND CAT then
14:
           data \leftarrow ReadData(len)
15:
       else if flags AND EXT then
16:
17:
           data \leftarrow \text{DECODEEXT}(len)
       else if flags AND RLE then
18:
           if flags AND ORDER then
19:
              data \leftarrow \text{DECODERLE1}(len)
20:
21:
              data \leftarrow \text{DECODERLEO}(len)
22:
           end if
23:
24:
       else
25:
           if flags AND Order then
              data \leftarrow \text{DECODEORDER1}(len)
26:
           else
27:
28:
              data \leftarrow DECODEORDERO(len)
           end if
29:
       end if
30:
                                                                                       ▶ Apply data transformations
       if flags AND PACK then
31:
32:
           data \leftarrow \text{DECODEPack}(data, P, nsym, pack len)
       end if
33:
       return data
34:
35: end function
```

The specifics of each sub-format are described below, in the order (minus meta-data specific shuffling) they are applied.

• STRIPE: The byte stream consists of a 7-bit encoded uncompressed length and a byte holding the number of substreams N, and their 7-bit encoded compressed data streams lengths. This is then followed by the substreams themselves, each of which is a valid *cdata* stream as defined above, hence this offers a recursive mechanism as each substream has its own format byte.

The total uncompressed byte stream is then an interleaving of one byte in turn from each of the N substreams (in order of 1st to Nth). Thus an array of 32-bit unsigned integers could be unpacked using Stripe to compress each of the 4 8-bit components together with their own algorithm.

```
1: function DecodeStripe(len)
2:
        N \leftarrow \text{ReadUint8}
        for j \leftarrow 0 to N do
                                                                                                  ▶ Fetch N compressed lengths
3:
            clen_i \leftarrow READUINT7
4:
        end for
5:
6:
        for j \leftarrow 0 to N do
                                                                                                                \triangleright Decode N streams
            ulen_j \leftarrow (len \operatorname{div} N) + ((len \operatorname{mod} N) > j)
                                                                             \triangleright (x > y) expression being 1 if true, 0 if false
7:
            T_i \leftarrow ARITHDECODE(ulen_i)
8:
9:
        end for
```

```
10: for j \leftarrow 0 to N-1 do \triangleright Stripe
11: for i \leftarrow 0 to ulen_j - 1 do
12: out_{i \times N+j} \leftarrow T_{j,i}
13: end for
14: end for
15: return out
16: end function
```

- **NoSize**: Do not store the size of the uncompressed data stream. This information is not required when the data stream is one of the four sub-streams in the STRIPE format.
- CAT: If present, all other bit flags should be zero, with the possible exception of NoSize or Pack.

  The uncompressed data stream is the same as the compressed stream. This is useful for very short data where the overheads of compressing are too high.
- ORDER: Bit field defining order-0 (unset) or order-1 (set) entropy encoding, as described above by the DecodeOrder0 and DecodeOrder1 functions.
- RLE: Bit field defining whether the Order-0 and Order-1 encoding should also use a run-length. When set, the DecodeRLE0 and DecodeRLE1 functions will be used instead of DecodeOrder0 and DecodeOrder1.
- Ext: Instead of using the adaptive arithmetic coder for decompression (with or without RLE), this uses an compression codec defined in an "external" library. Currently the only supported such codec is Bzip2. In future more may be added, so the "magic number" (the file signature, typically in first few bytes of data) must be validated to check the external codec being used.

Given bzip2 is already supported elsewhere in CRAM, the purpose of adding it here is to permit bzip2 compression after Pack and Stripe transformations. This may be tidied up in later CRAM releases to clarify the separation between compression codecs and data transforms, but that requires more major restructuring so for compatibility with v3.0 these have been placed into this single codec.

```
    function DECODEEXT(len)
    if Bzip2 magic number is present then
    return DECODEBZIP2(len)
    else
    Error
    end if
    end function
```

• PACK: Data containing only 1, 2, 4 or 16 distinct values can have multiple values packed into a single byte (infinite, 8, 4 or 2). The distinct symbol values do not need to be adjacent as a mapping table P converts mapped value x to original symbol  $P_x$ .

The packed format is split into uncompressed meta-data (below) and the compressed packed data as described in the rANS Nx16 bit-packing section. The same DECODEPACKMETA and DECODEPACK functions are used.

#### 5 Name tokenisation codec

Sequence names (identifiers) typically follow a structured pattern and compression based on columns within those structures usually leads to smaller sizes. The sequence name (identifier) tokenisation relies heavily on the rANS Nx16 and Adaptive arithmetic coders described above.

As an example, take a series of names:

I17\_08765:2:123:61541:01763#9 I17\_08765:2:123:1636:08611#9 I17\_08765:2:124:45613:16161#9 We may wish to tokenise each of these into 7 tokens, e.g. "I17\_08765:2:", "123", ":", "61541", ":", "01763" and "#9". Some of these are multi-byte strings, some single characters, and some numeric, possibily with a leading zero. We also observe some regularly have values that match the previous line (the initial prefix string, colons, "#9") while others are numerically very close to the value in the previous line (124 vs 123).

The name tokeniser compares each name against a previous name (which is not necessarily the one immediately prior) and encodes this name either as a series of differences to the previous name or marking it as an exact duplicate. A maximum of 128 tokens are permitted within any single read name.

Token IDs (types) are listed below.

ID	Type	Value	Description	
0	TYPE	Type	Used to determine the type of token at a given position	
5	DUP	Integer (distance)	The entire name is a duplicate of an earlier one. Used in position	
			0 only	
6	DIFF	Integer (distance)	The entire name differs to earlier ones. Used in position 0 only	
1	STRING	String	A nul-terminated string of characters	
2	CHAR	Byte	A single character	
7	DIGITS	$0 \le \text{Int} < 2^{32}$	A numerical value, not containing a leading zero	
3	DIGITS0	$0 \le \text{Int} < 2^{32}$	A numerical value possibly starting in leading zeros	
4	DZLEN	Int length	Length of associated DIGITS0 token	
8	DELTA	$0 \le \text{Int} < 256$	A numeric value being stored as the difference to the numeric	
			value of this token on the previous name	
9	DELTA0	$0 \le \text{Int} < 256$	As DELTA, but for numeric values starting with leading zeros	
10	MATCH	(none)	This token is identical type and value to the same position in the	
			previous name (NB: not permitted for DELTA/DELTA0)	
11	NOP	(none)	Does nothing	
12	END	(none)	Marks end of name	

The tokens and values are stored in a 2D array of byte streams,  $B_{pos,type}$ , where pos 0 is reserved for name meta-data (whether it is a duplicate name) and pos 1 onwards is for the first, second and later tokens. Type is one of the token types listed above, corresponding to the type of data being stored. Some token types may also have associated values.  $B_{pos,TYPE}$  (type) holds the token type itself and that is then used to retrieve any associated value(s) if appropriate from  $B_{pos,type}$ . Thus multiple types at the same token position will have their values encoded in distinct data streams, e.g. if position 5 is of type either DIGITS or DELTA then data streams will exist for  $B_{5,TYPE}$ ,  $B_{5,DIGITS}$  and  $B_{5,DELTA}$ . Decoding per name continues until a token of type END is observed.

More detail on the token types is given below.

- **TYPE**: This is the first token fetched at each token position. It holds the type of the token at this position, which in turn may then require retrieval from type-specific data streams at this position. For position 0, the TYPE field indicates whether this record is an exact duplicate of a prior read name or has been encoded as a delta to an earlier one.
- **DUP**, **DIFF**: These types are fetched for position 0, at the start of each new identifier. The value is an integer value describing how many reads before this (with 1 being the immediately previous name) we are comparing against. When we subsequently refer to "previous name" below, we always mean the one indicated by the DIFF field and not the one immediately prior to the current name.

The first record will have a DIFF of zero and no delta or match operations are permitted.

- **STRING**: We fetch one byte at a time from the value byte stream, appending to the name buffer until the byte retrieved is zero. The zero byte is not stored in the name buffer. For purposes of token type MATCH, a match is defined as entirely matching the string including its length.
- CHAR: Fetch one single byte from the value byte stream and append to the name buffer.
- **DIGITS**: Fetch 4 bytes from the value byte stream and interpret these as a little endian unsigned integer. This is appended to the name buffer as string of base-10 digits, most significant digit first. Larger values may be represented, but will require multiple DIGITS tokens. Negative values may be encoded by treating the minus sign as a CHAR or STRING and storing the absolute value.
- **DIGITS0**, **DZLEN**: This fetches the 4 byte value from  $B_{pos,DIGITS0}$  and a 1 byte length from  $B_{pos,DZLEN}$ . As per DIGITS, the value is interpreted as a little endian unsigned integer. The length indicates the total

size of the numeric value when displayed in base 10 which must be greater than  $\log_{10}(value)$  with any remaining length indicating the number of leading zeros. For example if DIGITS0 value is 123 and DZLEN length is 5 the string "00123" must be appended to the name.

For purposes of the MATCH type, both value and length must match.

• **DELTA**: Fetch a 1 byte value and add this to the DIGITS value from the previous name. The token in the prior name must be of type DIGITS or DELTA.

MATCH is not supported for this type.

• **DELTA0**: As per DELTA, but the 1 byte value retrieved is added to the DIGITS0 value in the previous name. No DZLEN value is retrieved, with the length from the previous name being used instead. The token in the prior name must be of type DIGITS0 or DELTA0.

MATCH is not supported for this type.

• MATCH: This token matches the token at the same position in the previous name. (The previous name is permitted to also have a MATCH token at this position, in which case it recurses to its previous name.) MATCH is only valid when the token being matched against is CHAR, STRING, DIGITS, DIGITS0 or MATCH. (I.e. matching a numeric delta will not repeat the delta increment.)

No value is needed for MATCH tokens.

- NOP: This token type does nothing. The purpose of this is simply to permit skipping tokens in order to keep token numbers in sync, such as when processing "10" vs "-10" with the latter needing an additional "-" token.
- END: Marks the end of the name. A nul byte is added to the name output buffer. No value is needed for END tokens.

Decoding needs some simple functions to read successive bytes from our token byte streams, as 8-bit characters or unsigned integers, as 32-bit unsigned integers and nul-terminated strings. We reuse the READUINT32 and related functions with the byte array specified as input.

```
(Convert an integer to a string form in base-10 digits, at least len bytes long with leading zeros)

1: function LeftPadNumber(val, len)

2: str \leftarrow val \triangleright Implicit language-specific Integer to String conversion

3: while Length(str) < len do

4: str \leftarrow `0' + str

5: end while

6: return str

7: end function
```

For the main name decoding loop, we use a single dimensional array of names decoded so far, N, and a two dimensional array of their tokens T (indexed by name number n and token position t within that name). We define a function to decode the  $n^{th}$  name  $(N_n)$  using a previous  $m^{th}$  name  $(N_m)$ . The tokens T are used in MATCH and DELTA token types to copy data from when constructing the name.

Now we have the basic primitives for pulling from the B byte streams, decoding the  $n^{th}$  individual name is as follows<sup>7</sup>:

```
 \begin{array}{ll} (Decodes \ the \ n^{th} \ name, \ returning \ N_n \ and \ updating \ globals \ N_n \ and \ T_n) \\ 1: \ \mathbf{function} \ \mathsf{DECODESINGLENAME}(n) \\ 2: \ \ type \leftarrow \mathsf{READUINT8}(B_{0,TYPE}) \\ 3: \ \ dist \leftarrow \mathsf{READUINT32}(B_{0,type}) \\ 4: \ \ m \leftarrow n - dist \\ 5: \ \ \mathbf{if} \ type = \mathsf{DUP} \ \mathbf{then} \\ 6: \ \ N_n \leftarrow N_m \\ 7: \ \ T_n \leftarrow T_m \\ \qquad \qquad \triangleright \ \mathsf{Copy} \ \text{for all} \ T_{n,*} \\ \end{array}
```

<sup>&</sup>lt;sup>7</sup>For simplicity of algorithm description, we take a flexible approach as to whether we read/write T in numeric or string form. For example a DELTA token will fetch the previous token as a string, interpret it as a numeric value, add to it, and then write it back as a string. Practical implementations may wish to separate out T into distinct integer and string arrays.

```
return N_n
 8:
 9:
          end if
          t \leftarrow 1
                                                                                                                                         \triangleright Token number t
10:
          repeat
11:
               type \leftarrow \text{READUINT8}(B_{t,\text{TYPE}})
12:
               if type = CHAR then
13:
                    T_{n,t} \leftarrow \text{ReadChar}(B_{t,\text{Char}})
14:
               else if type = \mathtt{STRING} \ \mathbf{then}
15:
                    T_{n,t} \leftarrow \text{READSTRING}(B_{t,\text{STRING}})
16:
               else if type = DIGITS then
17:
                    T_{n,t} \leftarrow \text{ReadUint}32(B_{t,\text{Digits}})
18:
               else if type = DIGITSO then
19:
                    d \leftarrow \text{READUNT}32(B_{t,\text{DIGITSO}})
20:
                    l \leftarrow \text{ReadUint8}(B_{t, \text{DZLEN}})
21:
                    T_{n,t} \leftarrow \text{LeftPadNumber}(d, l)
22:
23:
               else if type = DELTA then
                    T_{n,t} \leftarrow T_{m,t} + \text{ReadUint8}(B_{t,\text{Delta}})
24:
               else if type = DELTAO then
25:
                    d \leftarrow T_{m,t} + \text{READUINT8}(B_{t,\text{DELTAO}})
26:
                    l \leftarrow \text{Length}(T_{m,t})
                                                                                                          ▷ String length including leading zeros
27:
                    T_{n,t} \leftarrow \text{LeftPadNumber}(d, l)
28:
               else if type = \texttt{MATCH then}
29:
                    T_{n,t} \leftarrow T_{m,t}
30:
               else
31:
                    T_{n,t} \leftarrow `
32:
               end if
33:
               N_n \leftarrow N_n \# T_{n,t}
34:
               t \leftarrow t + 1
35:
          \mathbf{until}\ type = \mathtt{END}
36.
          return N_n
37:
38: end function
```

Given a complex name with both position and type specific values, this can lead to many separate data streams. The name tokeniser codec is a format within a format, as the multiple byte streams  $B_{pos,type}$  are serialised into a single byte stream.

The serialised data stream starts with two unsigned little endiand 32-bit integers holding the total size of uncompressed name buffer and the number of read names. This is followed the array elements themselves.

Token types, ttype holds one of the token ID values listed above in the list above, plus special values to indicate certain additional flags. Bit 6 (64) set indicates that this entire token data stream is a duplicate of one earlier. Bit 7 (128) set indicates the token is the first token at a new position. This way we only need to store token types and not token positions.

The total size of the serialised stream needs to be already known, in order to determine when the token types finish.

Bytes	Type	Name	Description
4	uint32	$uncomp\_length$	Length of uncompressed name buffer
4	uint32	$num\_reads$	Number of read names
1	uint8	$use\_arith$	Whether compression is arithmetic (1) or rANS Nx16 (0)
For eac	h token da	ta stream	
1	uint8	ttype	Token type code plus flags (64=duplicate, 128=next token posi-
			tion).
If ttype	AND 64	$\overline{(duplicate)}$	
	uint8	$dup\_pos$	Duplicate from this token position
	uint8	$dup\_type$	Duplicate from this token type ID
else if	not duplice	ite	
?	uint7	clen	compressed length
clen	uint8[]	cdata	compressed data stream

A few tricks are used to remove some byte streams. In addition to the explicit marking of duplicate bytes streams, if a byte stream of token types is entirely MATCH apart from the very first value it is discarded. It is possible to regenerate this during decode by observing the other byte streams. For example if we have a byte stream  $B_{5,DIGITS}$  but no  $B_{5,TYPE}$  then we assume the contents of  $B_{5,TYPE}$  consist of one DIGITS type followed by as many MATCH types as are needed.

The *cdata* stream itself is as described in the relevant entropy encoder section above (rANS or arithmetic coding).

```
(Decodes and uncompresses the serialised token byte streams)
 1: function DecodeTokenByteStreams(use arith)
        sz \leftarrow 0
        t \leftarrow -1
 3:
        repeat
 4:
             ttype \leftarrow \text{ReadUint8}
 5:
             tok new \leftarrow ttype \text{ AND } 128
 6:
 7:
             tok \ dup \leftarrow ttype \ AND \ 64
 8:
             type \leftarrow ttype \text{ AND } 63
 9:
             if tok \quad new \neq 0 then
                 t \leftarrow t + 1
10:
                 if type \neq \texttt{TYPE then}
11:
                      B_{t,\text{TYPE}} \leftarrow (type, \text{TOK\_MATCH}, \text{TOK\_MATCH}, ...)
                                                                                                               \triangleright for nnames - 1 times
12:
13:
                 end if
14:
             end if
             if tok dup \neq 0 then
15:
                 dup \quad pos \leftarrow \text{ReadUint8}
16:
                 dup \ type \leftarrow \text{ReadUint8}
17:
18:
                 B_{t,type} \leftarrow B_{dup\ pos,dup\ type}
             else
19:
                 clen \leftarrow \text{ReadUint7}
20:
                 data \leftarrow \text{READDATA}(clen)
21:
                 if use arith then
22:
                      B_{t,tupe} \leftarrow ArithDecode(clen, source = data)
23:
24:
                      B_{t,type} \leftarrow \text{RansDecodeNx16}(clen, source = data)
25:
                 end if
26:
             end if
27:
28:
        until EOF
29:
        return B
30: end function
     (Decodes all names, returning N)
 1: function DecodeNames
        ulen \leftarrow \text{ReadUint}32
 2:
        nnames \leftarrow \text{ReadUint}32
 3:
 4:
        use \ arith \leftarrow \text{ReadUint8}
         B \leftarrow \text{DecodeTokenByteStreams}(use \ arith)
 5:
 6:
        for n \leftarrow 0 to nnames - 1 do
             N_n \leftarrow \text{DecodeSingleName}(n)
 7:
         end for
 8:
        return N
10: end function
```

### 6 FQZComp quality codec

The FQZComp quality codec uses an adaptive statistical model to predict the next quality value in a given context (comprised of previous quality values, position along this sequence, whether the sequence is the second in a pair, and a running total of number of times the quality has changed in this sequence).

For each position along the sequence, the models produce probabilities for all possible next quality values, which are passed into an arithmetic entropy encoder to encode or decode the actual next quality value. The models are then updated based on the actual next quality in order to learn the statistical properties of the quality data stream. This step wise update process is identical for both encoding and decoding.

The algorithm is a generalisation on the original fqzcomp program, described in *Compression of FASTQ and SAM Format Sequencing Data* by Bonfield JK, Mahoney MV (2013). PLoS ONE 8(3): e59190. https://doi.org/10.1371/journal.pone.0059190

#### 6.1 FQZComp Models

The FQZComp process utilises knowledge of the read lengths, complement (qualities reversed) status, and a generic parameter selector, but in order to maintain a strict separation between CRAM data series this knowledge is stored (duplicated) within the quality data stream itself. Note the complement model is only needed in CRAM 3.1 as CRAM 4 natively stores the quality in the original orientation already. Both reversed and duplication models have no context and are boolean values.

The parameter selector model also has no context associated with it and encodes  $max\_sel$  distinct values. The selector value may be quantised further using stab (Selector Table) to reduce the selector to fewer sets of parameters. This is useful if we wish to use the selector bits directly in the context using the same parameters. The selector is arbitrary and may be used for distinguishing READ1 from READ2, as a precalculated "delta" instead of the running total, distinguishing perfect alignments from imperfect ones, or any other factor that is shown to improve quality predictability and increase compression ratio (average quality, number of mismatches, tile, swathe, proximity to tile edge, etc).

The quality model has a 16-bit context used to address an array of  $2^{16}$  models, each model permitting  $max\_sym$  distinct quality values. The context used is defined by the FQZcomp parameters, of which there may be multiple sets, selected using the selector model. There are 4 read length models each having  $max\_sym$  of 256. Each model is used for the 4 successive bytes in a 32-bit length value.

The entropy encoder used is shared between all models, so the bit streams are multiplexed together.

The 16-bit quality value context is constructed by adding sub-contexts together consisting of previous quality values, position along the current record, a running count (per record) of how many times the quality value has differed to the previous one (delta), and an arbitrary stored selector value, each shifted to a defined location within the combined context value (qloc, ploc, dloc and sloc respectively). The qual, pos and delta sub-contexts are computed from the previous data while the selector, if used, is read directly from the compressed data stream. The selector may be used to switch parameter sets, or simply to group quality strings into arbitrary user-defined sub-sets. The numeric values for each of these components can be passed through lookup tables (qtab for quality, ptab for positions, dtab for running delta and stab for turning the selector s into a parameter index s. These all convert the monotonically increasing s to a (usually smaller) monotonically increasing s. For example if we wish to use the approximate position along a 100 byte string, we may uniformly map s to s to utilise 4 bits of our 16-bit combined context.

As some sequencing instruments produce binned qualities, e.g. 0, 10, 25, 35, these values are squashed to incremental values from 0 to  $max\_sym-1$  where  $max\_sym$  is the maximum number of distinct quality values observed. If this transform is required, the flag  $have\_qmap$  will be set and a mapping table (qmap) will hold the original quality values. The encoded qualities will be the smaller mapped range.

The quality sub-context is constructed by shifting left the previous quality sub-context by qshift bits and adding the current quality after passing through the qmap transform and if defined through the qtab lookup table. The quality context is limited to qbits long and is added to the combined context starting at bit qloc. The quality sub-context is reset to zero at the start of each new record. <sup>8</sup>

<sup>&</sup>lt;sup>8</sup>For example if we have 4 quality values in use – 0, 10, 25 and 35 – we will be encoding quality values 0, 1, 2 and 3. We may wish to define *qbits* to be 6 and *qshift* to be 2 such that the previous 3 quality values can be used as context, for the prediction of the next quality value. There will likely be little reason to use *qtab* in this scenario, but an encoder could define *qtab* to convert {0,

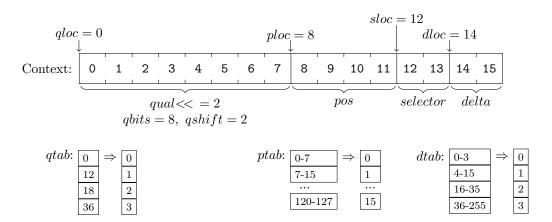


Figure 2: An example FQZComp configuration.

The position context is simply the number of remaining quality values in this record, so is a value starting at record length (minus 1) and decrementing. As with the quality context it may be passed through a lookup table ptab before shifting left by ploc bits and adding to the combined context.

Delta is a count of the number of times the quality value has changed from one value to a different one. Thus a run of identical values will not increase delta. It gets reset to zero at the start of every record. It may be adjusted by the dtab lookup table and is shifted by dloc before adding to the combined context.

The selector value may also be used as a sub-context, if the  $do\_sel$  paramter is set. The initial context value (reset per record) is defined within each parameter set, providing a more general purpose alternative to adding the selector value at a defined location (sloc) into the context.

Thus the full context can be updated after each decoded quality with the following pseudocode. Note for brevity this is assuming the pos, delta, prevq, qctx and sel parameters referred are global and updateable.

```
(Add quality q to produce and return a new context ctx)
 1: function FQZUPDATECONTEXT(params, q)
       ctx \leftarrow params.context
 2:
                                                                                                       ▶ Also the initial value
        qctx \leftarrow (qctx << params.qshift) + qtab_q
 3:
        ctx \leftarrow ctx + ((qctx \text{ AND } (2^{params.qbits} - 1)) << params.qloc)
 4:
        if params.pflags AND 32 then
                                                                                                                   \triangleright have ptab
 5:
 6:
            p \leftarrow \text{Min}(pos, 1023)
 7:
            ctx \leftarrow ctx + (ptab_p << params.ploc)
        end if
 8:
        if params.pflags AND 64 then
 9:
                                                                                                                   \triangleright have dtab
            d \leftarrow Min(delta, 255)
10:
            ctx \leftarrow ctx + (dtab_d << params.dloc)
11:
12:
            if prevq \neq q then
                delta \leftarrow delta + 1
13:
            end if
14:
            prevq \leftarrow q
15:
16:
        end if
                                                                                                                       \rhd do\_sel
       if params.pflags AND 8 then
17:
            ctx \leftarrow ctx + (sel << params.sloc)
18:
        end if
19:
       return ctx AND (2^{16} - 1)
20:
21: end function
```

In summary context is produced using the following models:

<sup>1, 2, 3</sup> to  $\{0, 0, 0, 0, 1\}$  and use qshift of 1 instead, giving us knowledge of which of the previous 6 values were maximum quality.

Model	Max symbol	Context size	Description
$model\_qual$	$max\_sym$	$2^{16}$	Primary model for quality values
$model\_len$	256	4	Read length models with the context 0-3 being successive
			byte numbers (little endian order)
$model\_rev$	2	none	Used if $pflags.do\_rev$ is defined. Indicating which strings
			to reverse.
$model\_dup$	2	none	Used if $pflags.do\_dup$ is defined. Indicates if this whole
			string is a duplicate of the last one
$model\_sel$	$max\_sel$	none	Used if $gflags.multi\_param$ or $pflags.do\_sel$ are defined.

# 6.2 FQZComp Data Stream

The start of an FQZComp data stream consists of the parameters used by the decoder. The data layout is as follows.

${f Bits}$	$\mathbf{Type}$	$\mathbf{Name}$	Description
8	uint8	version	FQZComp format version: must be 5
8	uint8	gflags	Global FQZcomp bit-flags. From lowest bit to highest:
		9,10.90	1: multi param: indicates more than one parameter
			block is present. Otherwise set $nparam = 1$
			2: have stab: indicates the parameter selector is mapped
			through $stab$ . Otherwise set $stab_i = i$
			4: do_rev: model_revcomp will be used (CRAM v3.1)
$fmulti\_parar$	n gflag is set:		
8	uint8	nparam	Number of parameter blocks (defaults to 1)
f have_stab g	flaa is set:		
8	uint8	max sel	Maximum parameter selector value
variable	array	stab	Parameter selector table
variable	array	3740	Tarameter selector table
	7 , 1	( 1	
			ted via model_sel and stab)
16	uint16	context	Starting context value
8	uint8	pflags	Per-parameter block bit-flags. From lowest bit to high-
			est:
			1: Reserved
			2: do_dedup: model_dup will be used
			4: do_len: model_len will be used for every record
			8: do sel: model sel will be used
			16: have qmap: indicates quality map is present
			32: have ptab: Load ptab, otherwise position contexts
			are unused
			64: have dtab: Load dtab, otherwise delta contexts are
			unused
			128: have $qtab$ : Load $qtab$ , otherwise set $qtab_i = i$
0		200 0 00 00 00 1000	
8	uint8	max_sym	Total number of distinct quality values
4	uint4 (high)	qbits	Total number of bits for quality context
$\frac{4}{4}$	uint4 (low)	qshift	Left bit shift per successive quality in quality context
4 $ $	uint4 (high)	qloc	Bit position of quality context
$4 \mid$	uint4 (low)	sloc	Bit position of selector context
4	uint4 (high)	ploc	Bit position of position context
4	uint4 (low)	dloc	Bit position of delta context
If have qm	ap pflag is set:		
variable	$uint8[max\_sym]$	qmap	Map for unbinning quality values.
If have ata	b pflag is set:		
variable	array	qtab	Quality context lookup table
	v	quao	Quanty context tookup tuote
$If have\_tab$			
variable	array	ptab	Position context lookup table
If have_tab	pflag is set:		
<del>-</del>		1, 1	
variable	array	dtab	Delta context lookup table

FQZDECODEPARAMS below describes the pseudocode for reading the parameter block.

```
1: procedure FQZDECODEPARAMS
        vers \leftarrow \text{ReadUint8}
        if vers \neq 5 then
 3:
             ERROR
 4:
 5:
        end if
        gflags \leftarrow \text{ReadUint8}
 6:
 7:
        if gflags AND 1 then
                                                                                                                       \triangleright multi param
             nparam \leftarrow \text{ReadUint8}
 8:
             max\_sel \leftarrow nparam
 9:
        else
10:
             nparam \leftarrow 1
11:
12:
             max \quad sel \leftarrow 0
13:
        end if
        if gflags AND 2 then
                                                                                                                            \triangleright have stab
14:
             max \quad sel \leftarrow \text{ReadUint8}
15:
             stab \leftarrow \text{ReadArray}(256)
16:
        end if
17:
        max \quad sym \leftarrow 0
18:
        for p \leftarrow 0 to nparam - 1 do
19:
             param_p \leftarrow FQZDECODESINGLEPARAM
20:
21:
             if max\_sym < param_p.max\_sym then
                                                                                                 \triangleright Maximum across all param sets
22:
                 max\_sym \leftarrow param_p.max\_sym
             end if
23:
24:
        end for
25: end procedure
 1: function FQZDECODESINGLEPARAM
                          \leftarrow \text{ReadUint}16
        p.context
 2:
 3:
        p.flags
                           \leftarrow ReadUint8
        p.max\_sym \leftarrow \text{ReadUint8}
 4:
        p.first len \leftarrow 1
 5:
                    \leftarrow \text{ReadUint8}
 6:
        p.qbits \leftarrow x \text{ div } 16
 7:
        p.qshift \leftarrow x \bmod 16
 8:
                    \leftarrow \text{ReadUint8}
 9:
10:
        p.qloc
                    \leftarrow x \text{ div } 16
        p.sloc
                    \leftarrow x \bmod 16
11:
                    \leftarrow \text{ReadUint8}
12:
                    \leftarrow x \; \mathrm{div} \; 16
        p.ploc
13:
14:
        p.dloc
                    \leftarrow x \bmod 16
        if p.flags AND 16 then
                                                                                                                           ▶ Have qmap
15:
             for i \leftarrow 0 to p.max\_sym - 1 do
16:
                 p.qmap_i \leftarrow \text{READUINT8}
17:
             end for
18:
        end if
19:
        if p.flags AND 128 then
                                                                                                                            ▶ Have qtab
20:
             p.qtab \leftarrow \text{ReadArray}(256)
21:
22:
             for i \leftarrow 0 to 256 do
23:
                 p.qtab_i \leftarrow i
24:
25:
             end for
26:
        end if
27:
        if p.flags AND 32 then
                                                                                                                            \triangleright Have ptab
             p.ptab \leftarrow \text{ReadArray}(1024)
28:
29:
        if p.flags AND 64 then
                                                                                                                            ▶ Have dtab
```

```
31: p.dtab \leftarrow \text{READARRAY}(256)
32: end if
33: return p
34: end function
```

FQZCREATEMODELS creates the decoder models based on the above parameters and the shared range coder.

```
1: procedure FQZCREATEMODELS
       rc \leftarrow \text{RangeDecodeCreate}
       for i \leftarrow 0 to 3 do
3:
4:
           model\ len_i \leftarrow ModelCreate(256)
       end for
5:
       for i \leftarrow 0 to 2^{16} - 1 do
6:
           model \ qual_i \leftarrow ModelCreate(max \ sym + 1)
7:
8:
       model \ dup \leftarrow ModelCreate(2)
9:
       model \ rev \leftarrow ModelCreate(2)
10:
       if max sel > 0 then
11:
           model \ sel \leftarrow ModelCreate(max \ sel + 1)
12:
       end if
13:
14: end procedure
```

READARRAY reads an array A of size n which maps values 0 to n-1 to a smaller range (0 to m-1), both monotonically increasing. For efficiency this is done using a two-level run length encoding.

Assuming m < n there will be runs of the same value. We measure run lengths for all values (even if they are zero). For example an array  $A = \{0, 1, 3, 4, 5, 6, 7, 7, 7, 7\}$  may be converted to run lengths  $R = \{1, 1, 0, 1, 1, 1, 1, 1, 4\}$ . To keep values in this array fitting within one byte, long runs are broken down in a successive series of 255 values, so a run of length 600 becomes 255 255 90.

This array R is no longer monotonically increasing but may still have repeated values, so is run-length encoded by storing the number of additional values whenever the last two lengths match. This converts R to  $R2 = \{1, 1, +0, 0, 1, 1, +2, 4\}$  where the '+' symbol is shown purely to indicate the values representing the additional run-length copy numbers. (This also now turns the example run of 600 above into 255 255 0 90.)

The final array R2 is the stored data stream. The decoder process is the reverse of the above, starting by converting R2 to R and then A. The following pseudocode demonstrates this process.

```
1: function READARRAY(n)
         i, j, z \leftarrow 0
 2:
         last \leftarrow -1
 3:
 4:
          while z < n do
                                                                                                                                  \triangleright Convert R2 to R
              run \leftarrow \text{ReadUint8}
 5:
              R_i \leftarrow run
 6:
 7:
              j \leftarrow j + 1
 8:
              z \leftarrow z + run
              if run = last then
 9:
                   copy \leftarrow \text{ReadUint8}
10:
                   for x \leftarrow 1 to copy do
11:
                        R_i \leftarrow run
12:
                        j \leftarrow j + 1
13:
14:
                   end for
15:
                   z \leftarrow z + run \times copy
              end if
16:
              last \leftarrow run
17:
         end while
18:
19:
         i, j, z \leftarrow 0
         while z < n do
                                                                                                                                    \triangleright Convert R to A
20:
```

```
21:
              run \ len \leftarrow 0
              repeat
22:
                  part \leftarrow R_j
23:
                  j \leftarrow j + 1
24:
                  run \ len \leftarrow run \ len + part
25:
              until part \neq 255
26:
27:
              for x \leftarrow 1 to run len do
                  A_z \leftarrow i
28:
29:
                  z \leftarrow z + 1
              end for
30:
              i \leftarrow i + 1
31:
         end while
32:
         return A
33:
34: end function
```

The FQZComp main loop decodes data in the following order per read: read length (if not fixed), the flag for whether this is read 2 (if needed), a bit flag to indicate if the quality is duplicated (if needed), followed by record length number of quality values using various data gathered since the start of this read as context.

The output of this function is an array of quality values in the variable output, indexed with the  $i^{th}$  value via  $output_i$ . The output buffer is a concatenation of all quality values for each record. The record lengths are recorded, but note this is the number of qualities encoded in CRAM for this sequence record and this does not necessarily have to match the number of base calls (for example where qualities are explicitly specified for SNP bases but not elsewhere).

```
1: function FQZNEWRECORD
        sel \leftarrow 0
        x \leftarrow 0
 3:
 4:
        if max sel > 0 then
                                                                                                     ▶ Find parameter selector
            sel \leftarrow model \ sel. \texttt{ModelDecode}(rc)
 5:
            if have stab then
 6:
                x \leftarrow stab_{sel}
 7:
 8:
            end if
 9:
        end if
10:
        param \leftarrow params_x
        if param.do len or param.first len then
                                                                                                          ▷ Decode read length
11:
12:
            rec\ len \leftarrow DecodeLength(rc)
            param.last len \leftarrow rec len
13:
14:
            param.first len = 0
        else
15:
            rec\_len \leftarrow param.last\_len
16:
        end if
17:
18:
        pos \leftarrow rec len
                                                                                                      \triangleright Check if needs reversal
19:
        if param.do rev then
            rev_{rec} \leftarrow model\_rev. \texttt{ModelDecode}(rc)
20:
21:
            len_{rec} \leftarrow rec \ len
        end if
22:
        rec \leftarrow rec + 1
23:
        is dup \leftarrow 0
24:
        if do dedup then
                                                                                        ▷ Duplicate last string if appropriate
25:
            if model\_dup. \texttt{ModelDecode}(rc) > 0 then
26:
                is dup \leftarrow 1
27:
            end if
28:
29:
        end if
```

```
qctx \leftarrow 0
30:
        delta \leftarrow 0
31:
32:
        prevq \leftarrow 0
        \mathbf{return}\ x
                                                                                          \triangleright Tabulated parameter selector
33:
34: end function
 1: procedure FQZDECODE
        buf len \leftarrow ReadUint7
 2:
        FQZDecodeParams
 3:
        FQZCREATEMODELS
 4:
        i \leftarrow 0
 5:
                                                                                         ▶ Position in total quality block
        pos \leftarrow 0
                                                                         ▶ Remaining base count current quality string
 6:
 7: next_record:
        while i < buf\_len do
 8:
 9:
            if pos = 0 then
                                                                               ▷ Reset state at start of each new record
10:
                x \leftarrow \text{FQZNewRecord}
                if is dup = 1 then
11:
                    for j \leftarrow 0 to rec len - 1 do
12:
                        output_{i+j} \leftarrow output_{i+j-rec\ len}
13:
                    end for
14:
                    i \leftarrow i + rec len
15:
                    pos \leftarrow 0
16:
                    go to next_record
17:
                end if
18:
19:
                param \leftarrow params_x
                ctx \leftarrow param.context
20:
            end if
21:
            q \leftarrow model \quad qual_{ctx}.ModelDecode(rc)
                                                                                          ▶ Decode a single quality value
22:
23:
            if param.have qmap then
                output_i \leftarrow qmap_q
24:
            else
25:
                output_i \leftarrow q
27:
            end if
            ctx \leftarrow FQZUPDATECONTEXT(param, q)
                                                                                   ▶ Also updates qctx, prevq and delta
28:
            i \leftarrow i + 1
29:
            pos \leftarrow pos - 1
30.
        end while
31:
        if do rev then
32:
            ReverseQualities(output, buf len, rev, len)
33:
        end if
34:
35: end procedure
Read lengths are encoded as 4 8-bit bytes, each having its own model.
 1: function DecodeLength(rc)
        rec len \leftarrow model len_0.ModelDecode(rc)
        rec\_len \leftarrow rec\_len + (model\_len_1.ModelDecode(rc) << 8)
 3:
        rec\_len \leftarrow rec\_len + (model\_len_2.ModelDecode(rc) << 16)
        rec\ len \leftarrow rec\ len + (model\ len_3. ModelDecode(rc) << 24)
        return rec len
 6:
```

For CRAM v4.0 quality values are stored in their original FASTQ orientation. For CRAM v3.1 they are stored in their alignment orientation and it may be beneficial for compression purposes to reverse them first. If so do rev will be set and the ReverseQualities procedure called below after decoding.

7: end function

```
1: procedure REVERSEQUALITIES(qual, qual_len, rev, len)
         rec \leftarrow 0
 3:
         i \leftarrow 0
         while i < qual\_len do
 4:
             if rev_{rec} \neq 0 then j \leftarrow 0
 6:
                 k \leftarrow len_{rec} - 1 while j < k do
 7:
 8:
                      SWAP(qual_{i+j}, qual_{i+k})
 9:
10:
                      j \leftarrow j+1
                      k \leftarrow k-1
11:
                 end while
12:
13:
                 i \leftarrow i + len_{rec}
                 rec \leftarrow rec + 1
14:
15:
             end if
         end while
16:
17: end procedure
```