

## 7.6 Arithmetic Coding

- Arithmetic coding is a more modern coding method that usually out-performs Huffman coding.
- Huffman coding assigns each symbol a codeword which has an integral bit length. Arithmetic coding can treat the whole message as one unit.
- A message is represented by a half-open interval  $[a, b)$  where  $a$  and  $b$  are real numbers between 0 and 1. Initially, the interval is  $[0, 1)$ . When the message becomes longer, the length of the interval shortens and the number of bits needed to represent the interval increases.

## ALGORITHM 7.5 Arithmetic Coding Encoder

BEGIN

low = 0.0; high = 1.0; range = 1.0;

while (symbol != terminator)

{

get (symbol);

low = low + range \* Range\_low(symbol);

high = low + range \* Range\_high(symbol);

range = high - low;

}

output a code so that low <= code < high;

END

## Example: Encoding in Arithmetic Coding

| Symbol | Probability | Range        |
|--------|-------------|--------------|
| A      | 0.2         | [0, 0.2)     |
| B      | 0.1         | [0.2, 0.3)   |
| C      | 0.2         | [0.3, 0.5)   |
| D      | 0.05        | [0.5, 0.55)  |
| E      | 0.3         | [0.55, 0.85) |
| F      | 0.05        | [0.85, 0.9)  |
| \$     | 0.1         | [0.9, 1.0)   |

(a) Probability distribution of symbols.

Fig. 7.8: Arithmetic Coding: Encode Symbols “CAEE\$”

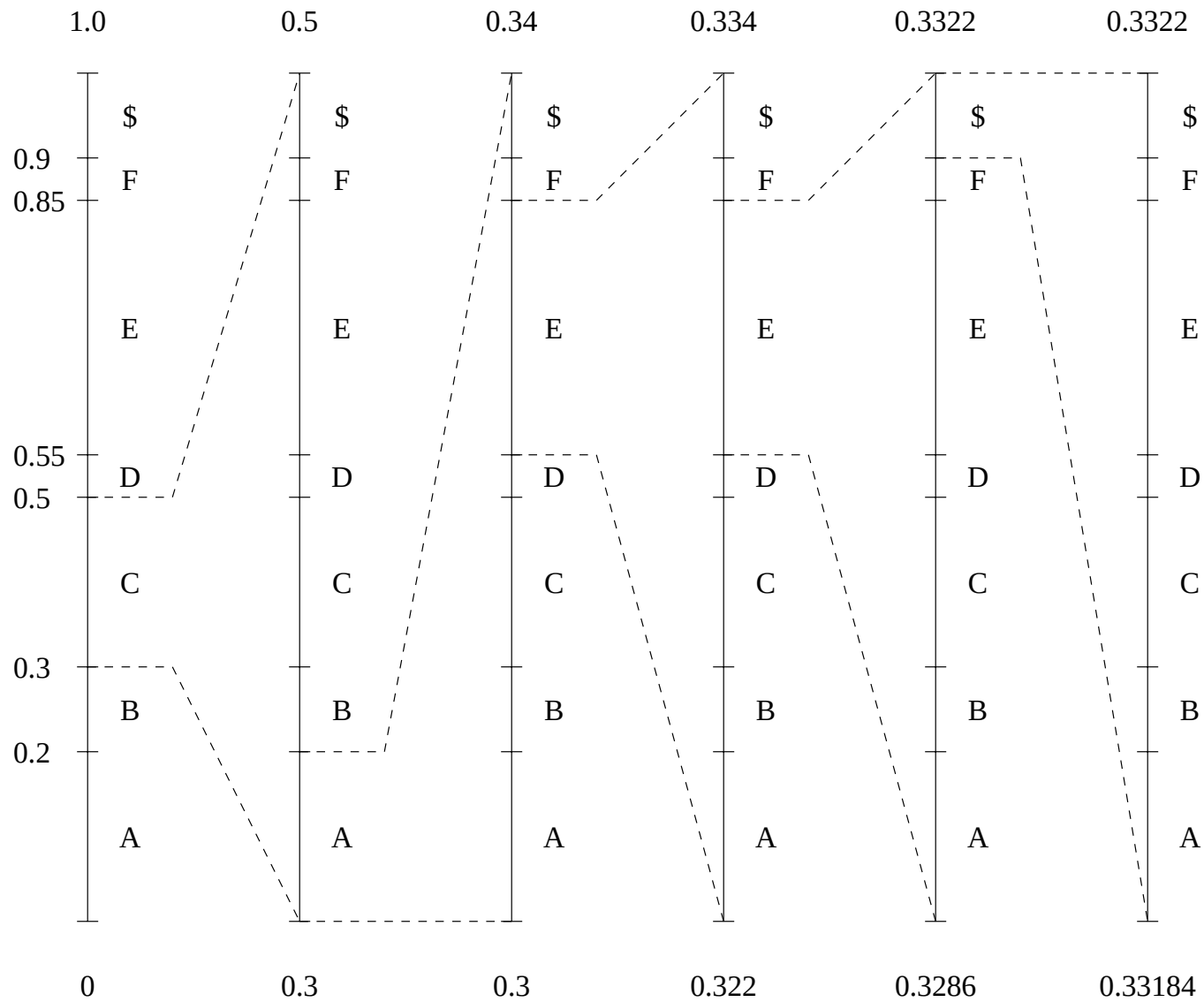


Fig. 7.8(b) Graphical display of shrinking ranges.

| Symbol | low     | high    | range   |
|--------|---------|---------|---------|
|        | 0       | 1.0     | 1.0     |
| C      | 0.3     | 0.5     | 0.2     |
| A      | 0.30    | 0.34    | 0.04    |
| E      | 0.322   | 0.334   | 0.012   |
| E      | 0.3286  | 0.3322  | 0.0036  |
| \$     | 0.33184 | 0.33220 | 0.00036 |

(c) New *low*, *high*, and *range* generated.

Fig. 7.8 (cont'd): Arithmetic Coding: Encode Symbols "CAEE\$"

## PROCEDURE 7.2 Generating Codeword for Encoder

```
BEGIN
    code = 0;
    k = 1;
    while (value(code) < low)
        { assign 1 to the kth binary fraction bit
          if (value(code) > high)
              replace the kth bit by 0

          k = k + 1;
        }
END
```

- The final step in Arithmetic encoding calls for the generation of a number that falls within the range  $[low, high)$ . The above algorithm will ensure that the shortest binary codeword is found.

## ALGORITHM 7.6 Arithmetic Coding Decoder

```
BEGIN
  get binary code and convert to
    decimal value = value(code);
  Do
    { find a symbol s so that
      Range_low(s) <= value < Range_high(s);
      output s;
      low = Rang_low(s);
      high = Range_high(s);
      range = high - low;
      value = [value - low] / range;
    }
  Until symbol s is a terminator
END
```

**Table 7.5 Arithmetic coding: decode symbols “CAEE\$”**

| value      | Output Symbol | low  | high | range |
|------------|---------------|------|------|-------|
| 0.33203125 | C             | 0.3  | 0.5  | 0.2   |
| 0.16015625 | A             | 0.0  | 0.2  | 0.2   |
| 0.80078125 | E             | 0.55 | 0.85 | 0.3   |
| 0.8359375  | E             | 0.55 | 0.85 | 0.3   |
| 0.953125   | \$            | 0.9  | 1.0  | 0.1   |



## 7.7 Lossless Image Compression

- **Approaches of Differential Coding of Images:**

- Given an original image  $I(x, y)$ , using a simple difference operator we can define a difference image  $d(x, y)$  as follows:

$$d(x, y) = I(x, y) - I(x - 1, y) \quad (7.9)$$

or use the discrete version of the 2-D Laplacian operator to define a difference image  $d(x, y)$  as

$$d(x, y) = 4 I(x, y) - I(x, y - 1) - I(x, y + 1) - I(x + 1, y) - I(x - 1, y) \quad (7.10)$$

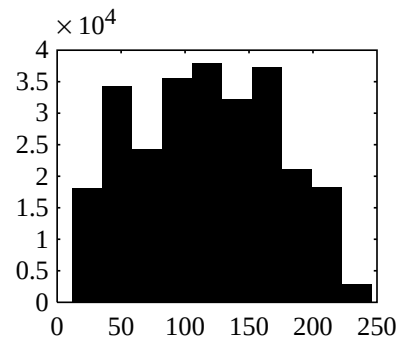
- Due to *spatial redundancy* existed in normal images  $I$ , the difference image  $d$  will have a narrower histogram and hence a smaller entropy, as shown in Fig. 7.9.



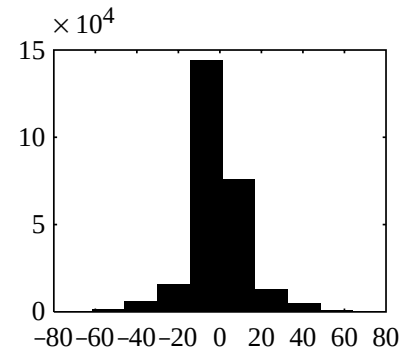
(a)



(b)



(c)



(d)

Fig. 7.9: Distributions for Original versus Derivative Images. (a,b): Original gray-level image and its partial derivative image; (c,d): Histograms for original and derivative images.

(This figure uses a commonly employed image called “Barb”.)