

Entropy Coding-based Lossless Compression of Asynchronous Event Sequences —Supplementary Material—

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Algorithm E1: Modified TTP_e Encoder of N_e

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Input:  $N_e, \hat{N}_e, \Delta_e = (\delta_1, \delta_2)$ ;
1 if  $N_e > 0$  then
2   Encode  $e_n = 0$  using  $DTeb_0$ ; Update  $DTeb_0$ ;
3    $\epsilon_e = N_e - \hat{N}_e$ ;  $\Delta_e = \delta_1 + \delta_2$ ;
4   if  $|\epsilon_e| < \delta_1$  then // R1 Range
5     Encode  $e_n = 0$  using  $DTeb_1$ ; Update  $DTeb_1$ ;
6     Encode  $e_n = |\epsilon_e|$  using  $Ee\delta_1\ell$ ; Update  $Ee\delta_1\ell$ ;
7   else
8     Encode  $e_n = 1$  using  $DTeb_1$ ; Update  $DTeb_1$ ;
9     if  $|\epsilon_e| < \Delta_e - 1$  then // R2 Range
10      Encode  $|\epsilon_e| - \delta_1$  using  $Ee\delta_2\ell$ ; Update  $Ee\delta_2\ell$ ;
11      else // R6 Range
12        Encode  $\delta_2 - 1$  using  $Ee\delta_2\ell$ ; Update  $Ee\delta_2\ell$ ;
13        Encode  $x_\gamma = |\epsilon_e| - \Delta_e - 2$  using Alg. E2;
14      Encode  $e_n = \text{sgn}(|\epsilon_e|)$  using  $DTeb_s$ ; Update  $DTeb_s$ ;
15 else
16   Encode  $e_n = 1$  using  $DTeb_0$ ; Update  $DTeb_0$ ;

```

Algorithm E2: Modified EGC Encoder of x_γ

```

Input:  $x_\gamma$ 
1 if  $x_\gamma = 1$  then
2   Encode  $x_n = 1$  using  $BR4$ ; Update  $BR4$  using (1);
3 else
4    $N = \lfloor \log_2(x_\gamma) \rfloor$ ; //  $(x_\gamma)_{(10)} = \overline{1b_{N-1} \dots b_1 b_0}_{(2)}$ 
5   for  $i = 1, 2, \dots, N$  do // Unary rep. of  $N$ 
6     Encode  $x_n = 0$  using  $BR4$ ; Update  $BR4$ ;
7   Encode  $x_n = 1$  using  $BR4$ ; Update  $BR4$ ;
8   Binarize  $(x_\gamma)_{(10)}$  as  $\overline{1b_{N-1} \dots b_1 b_0}_{(2)}$ ;
9   for  $i = N - 1, N - 2, \dots, 0$  do // Last  $N$  digits
10    Encode  $x_n = b_i$  using  $BR5$ ; Update  $BR5$ ;

```

Algorithm E3: Modified TTP_y Encoder of y

```

Input:  $y, \hat{y}, [1, W], \Delta = (\delta_1, \delta_2, \delta_3)$ ;
1  $\epsilon_y = y - \hat{y}$ ;  $\Delta_y = \delta_1 + \delta_2 + \delta_3$ ;
2 if  $|\epsilon_y| < \Delta_y$  then
3   Encode  $y_n = 0$  using  $DTyb_0$ ; Update  $DTyb_0$ ;
4   if  $|\epsilon_y| < \delta_1$  then // R1 Range
5     Encode  $y_n = 0$  using  $DTyb_1$ ; Update  $DTyb_1$ ;
6     Encode  $y_n = |\epsilon_y|$  using  $Ey\delta_1\ell$ ; Update  $Ey\delta_1\ell$ ;
7   else
8     Encode  $y_n = 1$  using  $DTyb_1$ ; Update  $DTyb_1$ ;
9     if  $|\epsilon_y| < \delta_1 + \delta_2$  then // R2 Range
10      Encode  $y_n = 0$  using  $DTyb_2$ ; Update  $DTyb_2$ ;
11      Encode  $|\epsilon_y| - \delta_1$  using  $Ey\delta_2\ell$ ; Update  $Ey\delta_2\ell$ ;
12      else // R3 Range
13        Encode  $y_n = 1$  using  $DTyb_2$ ; Update  $DTyb_2$ ;
14        Encode  $|\epsilon_y| - \delta_1 - \delta_2$  using  $Ey\delta_3\ell$ ; Update  $Ey\delta_3\ell$ ;
15 else // R5 Range
16   Encode  $y_n = 1$  using  $DTyb_0$ ; Update  $DTyb_0$ ;
17    $y_2 = \hat{y} + \Delta_y$ ;  $n_2 = \lceil \log_2(W - y_2 + 1) \rceil$ ;
18   Binarize  $(W - y)_{(10)}$  as  $\overline{b_{n_2-1} \dots b_1 b_0}_{(2)}$ ;
19   for  $i = 0, 1, \dots, n_2 - 2$  do
20     Encode  $y_{n+i} = b_i$  using  $ByL$ ; Update  $ByL$ ;
21   if  $\overline{b_{n_2-1} \dots b_1 b_0} \leq W - y_2 + 1 - 2^{n_2-1}$  then
22     Encode  $x_n = b_{n_2-1}$  using  $BR5$ ; Update  $BR5$ ;

```

Algorithm E4: Modified TP_x Encoder of x

Input: x, \hat{x}, c_x (to signal sorted x), $[1, H], \Delta = (\delta_1, \delta_2, \delta_3)$;
1 $\epsilon_x = x - \hat{x}; \Delta_x = \delta_1 + \delta_2 + \delta_3$;
2 **if** $|\epsilon_x| < \Delta_x$ **then**
3 **Encode** $x_n = 0$ using $DTxb_0$; **Update** $DTxb_0$;
4 **if** $|\epsilon_x| < \delta_1$ **then** // R1 Range
5 **Encode** $x_n = 0$ using $DTxb_1$; **Update** $DTxb_1$;
6 **Encode** $x_n = |\epsilon_x|$ using $Ex\delta_1\ell$; **Update** $Ex\delta_1\ell$;
7 **else**
8 **Encode** $x_n = 1$ using $DTxb_1$; **Update** $DTxb_1$;
9 **if** $|\epsilon_x| < \delta_1 + \delta_2$ **then** // R2 Range
10 **Encode** $x_n = 0$ using $DTxb_2$; **Update** $DTxb_2$;
11 **Encode** $|\epsilon_x| - \delta_1$ using $Ex\delta_2\ell$; **Update** $Ex\delta_2\ell$;
12 **else** // R3 Range
13 **Encode** $x_n = 1$ using $DTxb_2$; **Update** $DTxb_2$;
14 **Encode** $|\epsilon_x| - \delta_1 - \delta_2$ using $Ex\delta_3\ell$; **Update** $Ex\delta_3\ell$;
15 **if** c_x **then** // Was x sorted?
16 **Encode** $sgn(|\epsilon_x|)$ using $DTxb_s$; **Update** $DTxb_s$;
17 **else**
18 **Encode** $x_n = 1$ using $DTxb_0$; **Update** $DTxb_0$;
19 $x_1 = \hat{x} - \Delta_x; n_1 = \lceil \log_2 x_1 \rceil$;
20 $x_2 = \hat{x} + \Delta_x; n_2 = \lceil \log_2 (H - x_2 + 1) \rceil$;
21 **if** $x_1 < 1$ **then** // Deterministic case R5
22 **Binarize** $(H - x)_{(10)}$ as $\overline{b_{n_2-1} \dots b_1 b_0}_{(2)}$;
23 **for** $i = 0, 1, \dots, n_2 - 2$ **do**
24 **Encode** $x_{n+i} = b_i$ using BxL ; **Update** BxL ;
25 **if** $\overline{b_{n_2-1} \dots b_1 b_0} \leq H - x_2 + 1 - 2^{n_2-1}$ **then**
26 **Encode** $x_n = b_{n_2-1}$ using $BR5$; **Update** $BR5$;
27 **else if** $x_2 > H$ **then** // Deterministic case R4
28 **Binarize** $(x - 1)_{(10)}$ as $\overline{b_{n_1-1} \dots b_1 b_0}_{(2)}$;
29 **for** $i = 0, 1, \dots, n_1 - 2$ **do**
30 **Encode** $x_{n+i} = b_i$ using BxL ; **Update** BxL ;
31 **if** $\overline{b_{n_1-1} \dots b_1 b_0} \leq x_1 - 2^{n_1-1}$ **then**
32 **Encode** $x_n = b_{n_1-1}$ using $BR4$; **Update** $BR4$;
33 **else**
34 **if** $x \leq \hat{x} - \Delta_x$, **then** // R4 Range
35 **Encode** $x_n = 0$ using $DTxb_1^d$; **Update** $DTxb_1^d$;
36 **Binarize** $(x - 1)_{(10)}$ as $\overline{b_{n_1-1} \dots b_1 b_0}_{(2)}$;
37 **for** $i = 0, 1, \dots, n_1 - 2$ **do**
38 **Encode** b_i using BxL ; **Update** BxL ;
39 **if** $\overline{b_{n_1-1} \dots b_1 b_0} \leq x_1 - 2^{n_1-1}$ **then**
40 **Encode** b_{n_1-1} using $BR4$; **Update** $BR4$;
41 **else** // R5 Range
42 **Encode** $x_n = 1$ using $DTxb_1^d$; **Update** $DTxb_1^d$;
43 **Binarize** $(H - x)_{(10)}$ as $\overline{b_{n_2-1} \dots b_1 b_0}_{(2)}$;
44 **for** $i = 0, 1, \dots, n_2 - 2$ **do**
45 **Encode** b_i using BxL ; **Update** BxL ;
46 **if** $\overline{b_{n_2-1} \dots b_1 b_0} \leq H - x_2 + 1 - 2^{n_2-1}$ **then**
47 **Encode** b_{n_2-1} using $BR5$; **Update** $BR5$;

Algorithm D1: Modified TP_x Decoder of x

Input: $\hat{x}, [1, H], c_x, \Delta = (\delta_1, \delta_2, \delta_3)$;
Output: x ;
1 $b_0 \leftarrow$ **Decode** using $DTxb_0$; **Update** $DTxb_0$;
2 **if** $b_0 = 0$ **then**
3 $b_1 \leftarrow$ **Decode** using $DTxb_1$; **Update** $DTxb_1$;
4 **if** $b_1 = 0$ **then** $x \leftarrow$ **Decode** using $Ex\delta_1\ell$; **Update** $Ex\delta_1\ell$;
5 **else**
6 $b_2 \leftarrow$ **Decode** using $DTxb_2$; **Update** $DTxb_2$;
7 **if** $b_2 = 0$ **then** // R2 Range
8 $x = \delta_1 +$ **Decode** using $Ex\delta_2\ell$; **Update** $Ex\delta_2\ell$;
9 **else** $x = \delta_1 + \delta_2 +$ **Decode** using $Ex\delta_3\ell$; **Update** $Ex\delta_3\ell$;
10 $b_s = 1$;
11 **if** c_x **then** $b_s \leftarrow$ **Decode** using $DTxb_s$; **Update** $DTxb_s$;
12 $x \leftarrow (b_s = 0) ? (\hat{x} - x) : (\hat{x} + x)$;
13 **else**
14 $x = 0; x_1 = \hat{x} - \delta_1 - \delta_2 - \delta_3; x_2 = \hat{x} + \delta_1 + \delta_2 + \delta_3$;
15 $n_1 = \lceil \log_2 x_1 \rceil; n_2 = \lceil \log_2 (H - x_2 + 1) \rceil$;
16 **if** $x_1 < 1$ **then** // Deterministic case R5
17 **for** $i = 0, 1, \dots, n_2 - 2$ **do**
18 $b \leftarrow$ **Decode** using BxL ; **Update** BxL ;
19 **if** $b = 1$ **then** $x = (1 \ll i)|x$;
20 **if** $x \leq H - x_2 + 1 - 2^{n_2-1}$ **then**
21 $b \leftarrow$ **Decode** using $BR5$; **Update** $BR5$;
22 **if** $b = 1$ **then** $x = (1 \ll (n_2 - 1))|x$;
23 **else if** $x_2 > H$ **then** // Deterministic case R4
24 **for** $i = 0, 1, \dots, n_1 - 2$ **do**
25 $b \leftarrow$ **Decode** using BxL ; **Update** BxL ;
26 **if** $b = 1$ **then** $x = (1 \ll i)|x$;
27 **if** $x \leq x_1 - 2^{n_1-1}$ **then**
28 $b \leftarrow$ **Decode** using $BR4$; **Update** $BR4$;
29 **if** $b = 1$ **then** $x = (1 \ll (n_1 - 1))|x$;
30 **else**
31 $b_1^d \leftarrow$ **Decode** using $DTxb_1^d$; **Update** $DTxb_1^d$;
32 **if** $b_1^d = 0$ **then** // R4 Range
33 **for** $i = 0, 1, \dots, n_1 - 2$ **do**
34 $b \leftarrow$ **Decode** using BxL ; **Update** BxL ;
35 **if** $b = 1$ **then** $x = (1 \ll i)|x$;
36 **if** $x \leq x_1 - 2^{n_1-1}$ **then**
37 $b \leftarrow$ **Decode** using $BR4$; **Update** $BR4$;
38 **if** $b = 1$ **then** $x = (1 \ll (n_1 - 1))|x$;
39 **else** // R5 Range
40 **for** $i = 0, 1, \dots, n_2 - 2$ **do**
41 $b \leftarrow$ **Decode** using BxL ; **Update** BxL ;
42 **if** $b = 1$ **then** $x = (1 \ll i)|x$;
43 **if** $x \leq H - x_2 + 1 - 2^{n_2-1}$ **then**
44 $b \leftarrow$ **Decode** using $BR5$; **Update** $BR5$;
45 **if** $b = 1$ **then** $x = (1 \ll (n_2 - 1))|x$;
46 **Return** x ;

Algorithm D2: Modified TTP_e Decoder of N_e

Input: $\hat{N}_e, \Delta = (\delta_1, \delta_2)$;
Output: N_e ;

```
1  $b_0 \leftarrow$  Decode using  $DTEb_0$ ; Update  $DTEb_0$ ;  
2 if  $b_0 = 0$  then  
3    $b_1 \leftarrow$  Decode using  $DTEb_1$ ; Update  $DTEb_1$ ;  
4   if  $b_1 = 0$  then  $e \leftarrow$  Decode using  $Ee\delta_1\ell$ ; Update  $Ee\delta_1\ell$ ;  
5   else  
6      $e \leftarrow$  Decode using  $DTEb_2$ ; Update  $DTEb_2$ ;  
7     if  $e = \delta_2 - 1$  then  
8        $e \leftarrow \delta_1 + \delta_2 - 2$  + Decode using Alg. 3;  
9     else  $e \leftarrow \delta_1 + e$ ;  
10   $b_s \leftarrow$  Decode using  $DTEb_s$ ; Update  $DTEb_s$ ;  
11  Return  $N_e = (b_s = 0) ? (\hat{N}_e - e) : (\hat{N}_e + e)$ ;  
12 else  
13 | Return  $N_e = 0$ 
```

Algorithm D3: Modified EGC Decoder of x_γ

Output: x_γ ;

```
1  $x_\gamma \leftarrow$  Decode using  $BR4$ ; Update  $BR4$ ;  
2 if  $x_\gamma = 0$  then  
3    $N = 1$ ;  $x_\gamma \leftarrow$  Decode using  $BR4$ ; Update  $BR4$ ;  
4   while  $x = 0$  do  
5      $N = N + 1$ ;  $x_\gamma \leftarrow$  Decode using  $BR4$ ; Update  $BR4$ ;  
6   for  $i = N - 1, N - 2, \dots, 0$  do  
7      $x_\gamma = (x_\gamma \ll 1) +$  Decode using  $BR5$ ; Update  $BR5$ ;  
8 Return  $x_\gamma$ ;
```

Algorithm D4: Modified TTP_y Decoder of y

Input: $\hat{y}, [1, W], \Delta = (\delta_1, \delta_2, \delta_3)$;
Output: y ;

```
1  $b_0 \leftarrow$  Decode using  $DTyb_0$ ; Update  $DTyb_0$  using (1);  
2 if  $b_0 = 0$  then  
3    $b_1 \leftarrow$  Decode using  $DTyb_1$ ; Update  $DTyb_1$ ;  
4   if  $b_1 = 0$  then // R1 Range  
5      $y = \hat{y} +$  Decode using  $Ey\delta_1\ell$ ; Update  $Ey\delta_1\ell$ ;  
6   else  
7      $b_2 \leftarrow$  Decode using  $DTyb_2$ ; Update  $DTyb_2$ ;  
8      $y \leftarrow \hat{y} + \delta_1$ ;  
9     if  $b_2 = 0$  then // R2 Range  
10       $y = y +$  Decode using  $Ey\delta_2\ell$ ; Update  $Ey\delta_2\ell$ ;  
11     else // R3 Range  
12       $y = y + \delta_2 +$  Decode using  $Ey\delta_3\ell$ ; Update  $Ey\delta_3\ell$ ;  
13 else // R5 Range  
14    $y = 0$ ;  $n_2 = \lceil \log_2 (W - \hat{y} - \delta_1 - \delta_2 - \delta_3 + 1) \rceil$ ;  
15   for  $i = 0, 1, \dots, n_2 - 2$  do  
16      $b \leftarrow$  Decode using  $ByL$ ; Update  $ByL$ ;  
17     if  $b = 1$  then  $y = (1 \ll i)|y$ ;  
18   if  $y \leq W - \hat{y} - \delta_1 - \delta_2 - \delta_3 + 1 - 2^{n_2-1}$  then  
19      $b \leftarrow$  Decode using  $BR5$ ; Update  $BR5$ ;  
20     if  $b = 1$  then  $y = (1 \ll (n_2 - 1))|y$ ;  
21 Return  $y$ ;
```
