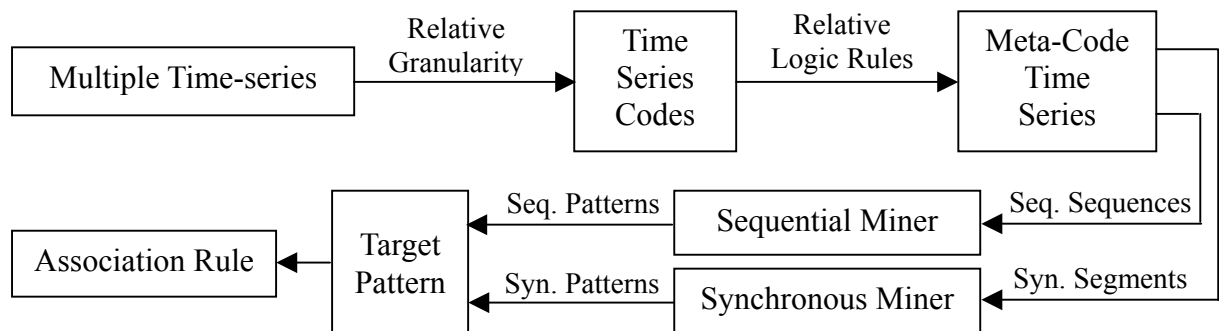




Discovering Patterns in Multiple Time-series

1. Synchronous Multi-sequence Modeling



Model Characteristics

- Multi-sequence pattern (including extra-relationship)
- Real-life applications
- Possible and simple implementation

2. Synchronous Multiple-sequence

Multi-sequence: $\{ (A_1 B_3 C_3 D_2), (A_3 B_4 C_2 D_1), (A_1 B_2 C_1 D_3), (A_2 B_1 C_2 D_4), \dots \}$

Equivalent seq.: $\{ (B_3 A_1 D_2 C_3), (C_2 D_1 B_4 A_3), (D_3 B_2 A_1 C_1), (A_2 C_2 D_4 B_1), \dots \}$

Multi-Sequence Pattern: $\{ (A_2 B_1 C_2 D_4), (A_3 B_4 C_4 D_1), (A_4 B_3 C_2 D_1) \}$

Relationship notation: $((A_2 B_1 C_2 D_4)) \mapsto ((A_3 B_4 C_4 D_1)) \mapsto ((A_4 B_3 C_2 D_1))$

Time-series of event A	A ₁	A ₃	A ₁	A ₂	A ₃	A ₄	A ₃	A ₅	...	A ₂	...	A ₅	A ₄
Time-series of event B	B ₃	B ₄	B ₂	B ₁	B ₄	B ₃	B ₁	B ₃	...	B ₁	...	B ₁	B ₁
Time-series of event C	C ₃	C ₂	C ₁	C ₂	C ₄	C ₂	C ₆	C ₄	...	C ₅	...	C ₆	C ₁
Time-series of event D	D ₂	D ₁	D ₃	D ₄	D ₁	D ₁	D ₂	D ₃	...	D ₂	...	D ₂	D ₄
Time Granularities	t+1	t+2	t+3	t+4	t+5	t+6	t+7	t+8	...	t+k	...	t+n-1	t+n

Mathematics notation: $M_{u Seq_v(t)}^{Syn^i_j(e)}$

Above Multi-Sequence is $M_{\mapsto_1 t_n}^{\uparrow A^5 B^4 C^6 D^4}$

Above Pattern is $M_{\mapsto (t_4 t_5 t_6)}^{\uparrow (A_2 B_1 C_2 D_4) \uparrow (A_3 B_4 C_4 D_1) \uparrow (A_4 B_3 C_2 D_1)}$

where i is nos. of codes in each series
 j is nos. of time-series
 u is starting time of series
 v is sending time of series
 t is time granularity of pattern
 e is events of series

, hence t_4 is $(A_2 \uparrow B_1 \uparrow C_2 \uparrow D_4)$

3. Pattern Formats

Standard Pattern	Weak Relative Pattern	Strong Relative Pattern	Tree Pattern																																																																
<table border="1"><tr><td>A₃</td><td>x</td><td>x</td><td>x</td></tr><tr><td>B₁</td><td>B₂</td><td>x</td><td>x</td></tr><tr><td>C₂</td><td>x</td><td>C₃</td><td>x</td></tr><tr><td>D₂</td><td>x</td><td>x</td><td>D₂</td></tr></table>	A ₃	x	x	x	B ₁	B ₂	x	x	C ₂	x	C ₃	x	D ₂	x	x	D ₂	<table border="1"><tr><td>x</td><td>x</td><td>A₂</td><td>x</td></tr><tr><td>B₁</td><td>x</td><td>x</td><td>x</td></tr><tr><td>x</td><td>x</td><td>x</td><td>C₂</td></tr><tr><td>D₂</td><td>x</td><td>x</td><td>x</td></tr></table>	x	x	A ₂	x	B ₁	x	x	x	x	x	x	C ₂	D ₂	x	x	x	<table border="1"><tr><td>A₂</td><td>A₁</td><td>x</td><td>A₂</td></tr><tr><td>x</td><td>B₂</td><td>B₁</td><td>B₃</td></tr><tr><td>x</td><td>C₄</td><td>C₃</td><td>x</td></tr><tr><td>D₂</td><td>D₁</td><td>x</td><td>D₂</td></tr></table>	A ₂	A ₁	x	A ₂	x	B ₂	B ₁	B ₃	x	C ₄	C ₃	x	D ₂	D ₁	x	D ₂	<table border="1"><tr><td>x</td><td>x</td><td>A₂</td><td>A₂</td></tr><tr><td>x</td><td>B₂</td><td>x</td><td>B₃</td></tr><tr><td>C₂</td><td>x</td><td>C₃</td><td>C₂</td></tr><tr><td>x</td><td>D₁</td><td>D₁</td><td>D₂</td></tr></table>	x	x	A ₂	A ₂	x	B ₂	x	B ₃	C ₂	x	C ₃	C ₂	x	D ₁	D ₁	D ₂
A ₃	x	x	x																																																																
B ₁	B ₂	x	x																																																																
C ₂	x	C ₃	x																																																																
D ₂	x	x	D ₂																																																																
x	x	A ₂	x																																																																
B ₁	x	x	x																																																																
x	x	x	C ₂																																																																
D ₂	x	x	x																																																																
A ₂	A ₁	x	A ₂																																																																
x	B ₂	B ₁	B ₃																																																																
x	C ₄	C ₃	x																																																																
D ₂	D ₁	x	D ₂																																																																
x	x	A ₂	A ₂																																																																
x	B ₂	x	B ₃																																																																
C ₂	x	C ₃	C ₂																																																																
x	D ₁	D ₁	D ₂																																																																

where x is wild-card of pattern

- Non-target Patterns

Perfect Pattern	Missing Sequence	Missing Synchronous	Non-multiple Sequences																																																																
<table border="1"><tr><td>A₃</td><td>A₁</td><td>A₂</td><td>A₂</td></tr><tr><td>B₁</td><td>B₂</td><td>B₁</td><td>B₃</td></tr><tr><td>C₂</td><td>C₄</td><td>C₃</td><td>C₂</td></tr><tr><td>D₂</td><td>D₁</td><td>D₁</td><td>D₂</td></tr></table>	A ₃	A ₁	A ₂	A ₂	B ₁	B ₂	B ₁	B ₃	C ₂	C ₄	C ₃	C ₂	D ₂	D ₁	D ₁	D ₂	<table border="1"><tr><td>A₃</td><td>x</td><td>x</td><td>x</td></tr><tr><td>B₁</td><td>x</td><td>x</td><td>x</td></tr><tr><td>C₂</td><td>x</td><td>x</td><td>x</td></tr><tr><td>D₂</td><td>x</td><td>x</td><td>x</td></tr></table>	A ₃	x	x	x	B ₁	x	x	x	C ₂	x	x	x	D ₂	x	x	x	<table border="1"><tr><td>A₃</td><td>x</td><td>x</td><td>x</td></tr><tr><td>x</td><td>B₂</td><td>x</td><td>x</td></tr><tr><td>x</td><td>x</td><td>C₃</td><td>x</td></tr><tr><td>x</td><td>x</td><td>x</td><td>D₂</td></tr></table>	A ₃	x	x	x	x	B ₂	x	x	x	x	C ₃	x	x	x	x	D ₂	<table border="1"><tr><td>A₃</td><td>A₁</td><td>A₂</td><td>A₂</td></tr><tr><td>x</td><td>x</td><td>x</td><td>x</td></tr><tr><td>x</td><td>x</td><td>x</td><td>x</td></tr><tr><td>x</td><td>x</td><td>x</td><td>x</td></tr></table>	A ₃	A ₁	A ₂	A ₂	x	x	x	x	x	x	x	x	x	x	x	x
A ₃	A ₁	A ₂	A ₂																																																																
B ₁	B ₂	B ₁	B ₃																																																																
C ₂	C ₄	C ₃	C ₂																																																																
D ₂	D ₁	D ₁	D ₂																																																																
A ₃	x	x	x																																																																
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x	x	x	x																																																																

Not happen in real situation

- Target Pattern

Pattern should be included *Synchronous* and *Sequential* pattern bonding with *Singular Event*.

Trigger Event B ₁	Ideal Pattern	Temporal Relations Pattern																																																				
Synchronous Sequential		Fixed Time Granularities																																																				
<table border="1"><tr><td>A₃</td></tr><tr><td>B₁</td></tr><tr><td>C₂</td></tr><tr><td>D₄</td></tr></table> and <table border="1"><tr><td>B₁</td><td>B₂</td><td>C₃</td><td>D₂</td></tr></table> ⇒	A ₃	B ₁	C ₂	D ₄	B ₁	B ₂	C ₃	D ₂	<table border="1"><tr><td>A₃</td><td>x</td><td>x</td><td>x</td></tr><tr><td>B₁</td><td>B₂</td><td>x</td><td>x</td></tr><tr><td>C₂</td><td>x</td><td>C₃</td><td>x</td></tr><tr><td>D₄</td><td>x</td><td>x</td><td>D₄</td></tr></table>	A ₃	x	x	x	B ₁	B ₂	x	x	C ₂	x	C ₃	x	D ₄	x	x	D ₄	<table border="1"><tr><td>A₂</td><td>∅</td><td>x</td><td>∅</td><td>x</td><td>∅</td><td>x</td></tr><tr><td>B₁</td><td>∅</td><td>B₂</td><td>∅</td><td>x</td><td>∅</td><td>x</td></tr><tr><td>C₂</td><td>∅</td><td>x</td><td>∅</td><td>C₃</td><td>∅</td><td>x</td></tr><tr><td>D₄</td><td>∅</td><td>x</td><td>∅</td><td>x</td><td>∅</td><td>D₂</td></tr></table>	A ₂	∅	x	∅	x	∅	x	B ₁	∅	B ₂	∅	x	∅	x	C ₂	∅	x	∅	C ₃	∅	x	D ₄	∅	x	∅	x	∅	D ₂
A ₃																																																						
B ₁																																																						
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B ₁	B ₂	x	x																																																			
C ₂	x	C ₃	x																																																			
D ₄	x	x	D ₄																																																			
A ₂	∅	x	∅	x	∅	x																																																
B ₁	∅	B ₂	∅	x	∅	x																																																
C ₂	∅	x	∅	C ₃	∅	x																																																
D ₄	∅	x	∅	x	∅	D ₂																																																

∅ Wild Card of Events in Time-series, e.g. Sunday or Holiday in financial market.

- Metarule-Guided of Association Rule

Meta-rule template:

If $P_i(t+k) = Q_j(t+k)$ then

$$\begin{cases} P_A(t+k) \wedge P_B(t+k) \wedge P_C(t+k) \wedge P_D(t+k) \Rightarrow Q_j(t) \wedge Q_j(t+1) \wedge Q_j(t+2) \wedge Q_j(t+3) \\ Q_j(t) \wedge Q_j(t+1) \wedge Q_j(t+2) \wedge Q_j(t+3) \Rightarrow P_A(t+k) \wedge P_B(t+k) \wedge P_C(t+k) \wedge P_D(t+k) \end{cases}$$

where P is in synchronous and Q is in sequential

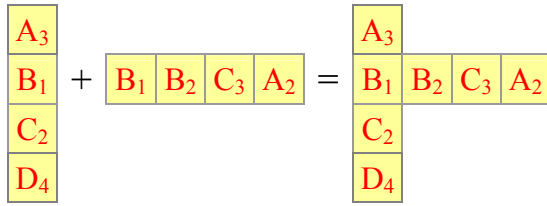
$P_i (i = A, B, C, D)$

$Q_j (j = A, B, C, D)$

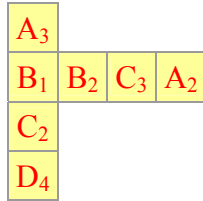
$k = 0, 1, 2, 3$

• Correlative Patterns (*single event junction*)

Actual Relationship Pattern of B₁



Direct relationship in synchronous pattern
 B₁ A₃ , B₁ C₂ , B₁ D₄
 Indirect relationship in synchronous pattern
 A₃ C₂ , A₃ D₄ , C₂ D₄
 Direct relationship in sequential pattern
 B₁ B₂ , B₁ C₃ , B₁ A₂
 Indirect relationship in sequential pattern
 B₂ C₃ , B₂ A₂ , C₃ A₂



Direct relationship of pattern
 B₁ A₃ , B₁ C₂ , B₁ D₄ , B₁ B₂ , B₁ C₃ , B₁ A₂
 Non-direct relationship of pattern
 D₄ B₂ , C₂ B₂ , A₃ B₂ , A₃ C₃ , A₃ A₂ , ...

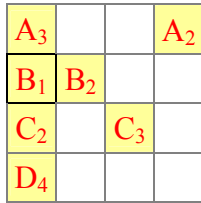
Relationship bonding probability

If A₃B₁ = 0.5, B₁C₃ = 0.9, then A₃C₃ = 0.5 × 0.9 = 0.45

If D₄C₂ = 0.6, C₂B₁ = 0.8, B₁A₂ = 0.9, then D₄A₂ = 0.6 × 0.8 × 0.9 = 0.432

• Presentation of Target Patterns

Visualization



t+1 t+2 t+3 t+4

Numerical

A	3			2
B	1*	2		
C	2		3	
D	4			

t+1 t+2 t+3 t+4

Mathematical Notations

$$\begin{pmatrix} 3 & 0 & 0 & 2 \\ 1* & 2 & 0 & 0 \\ 2 & 0 & 3 & 0 \\ 4 & 0 & 0 & 0 \end{pmatrix} = M \begin{matrix} \uparrow(A_3 B_1 C_2 D_4) \uparrow B_2 \uparrow C_3 \uparrow A_2 \\ \mapsto (t_1 t_2 t_3 t_4) \end{matrix}$$

where * is the correlative event

• Correlative Junction

Correlative junction event (C₂) & (C₃):

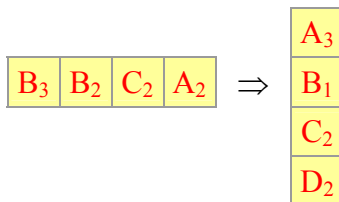
The sequence B₃ → B₂ → C₂ → A₂ can be expressed in B₃(t) ∧ B₂(t+1) ∧ C₂(t+2) ∧ A₂(t+3) format.

And segment A₃ ∧ B₁ ∧ C₃ ∧ D₂ is expressed in A₃(t+2) ∧ B₁(t+2) ∧ C₃(t+2) ∧ D₂(t+2) format.

Sequential Bonding

In case trigger event is C₂ the rule as below:

If B₃ → B₂ → C₂ → A₂ Then A₃ ∧ B₁ ∧ C₂ ∧ D₂



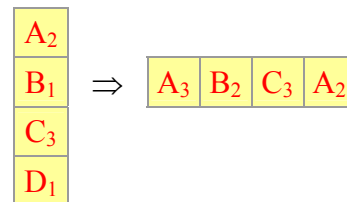
In case trigger sequence is B₂ → C₂ the rule is

If B₃ → B₂ → C₂ → A₂ Then A₃ ∧ B₁ ∧ C₂ ∧ D₂

Synchronous Bonding

In case trigger event is C₃ the rule as below:

If A₂ ∧ B₁ ∧ C₃ ∧ D₁ Then A₃ → B₂ → C₃ → A₂



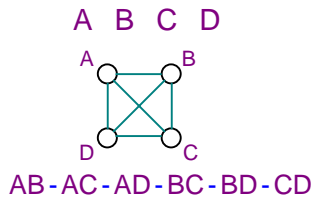
In case trigger events are A₂ ∧ C₃ the rule is

If A₂ ∧ B₁ ∧ C₃ ∧ D₁ Then A₃ → B₂ → C₃ → A₂

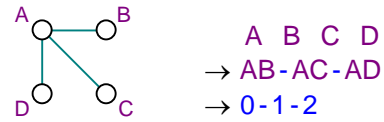
4. Synchronous Pattern Correlative intersection

- Correlative intersect cases

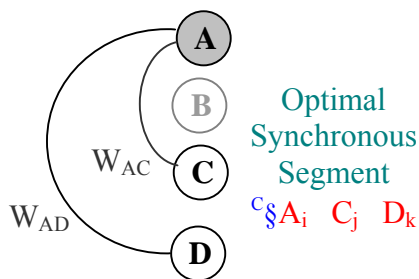
Mutual Relationships among 4 Synchronous Events



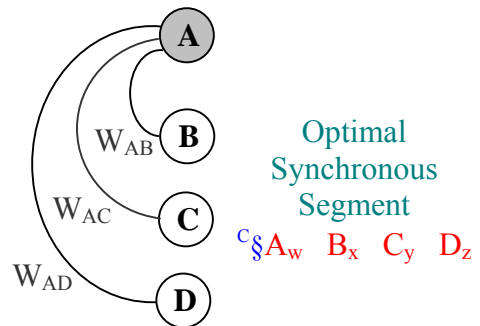
e.g. AB → 0, AC → 1, AD → 2,
BC → 3, BD → 4, CD → 5.



- Local maximal segment



- Global maximal segment



- Correlative Junction Event

n is number of time-series
w is numbers of wild card

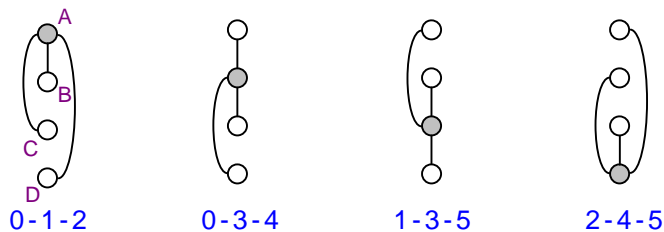
$$\sum \text{Syn_seg_}\#w = n \times \binom{p}{r} = n \times \frac{p!}{r!(p-r)!}$$

where $p = n - 1$, $r = n - w - 1$

$$\sum \text{Syn_seg} = n(2^{n-1} - 1)$$

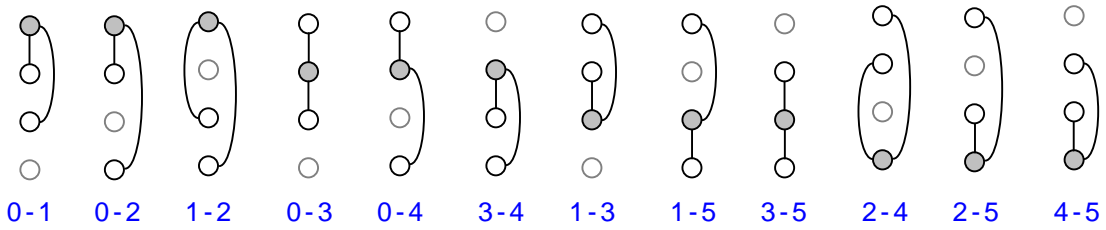
Possible Correlative Event Relationships among 4 Synchronous Events

$$\sum \text{Syn_seg_}\#0 = 4 \times \binom{3}{3} = 4 \times \frac{3 \times 2 \times 1}{(3 \times 2 \times 1)(1)} = 4 \times 1 = 4$$



Possible Correlative Event Relationships among 3 Synchronous Events

$$\sum \text{Syn_seg_}\#1 = 4 \times \binom{3}{2} = 4 \times \frac{3 \times 2 \times 1}{(2 \times 1)(1)} = 4 \times 3 = 12$$



Maximum Synchronous sequence

$Code_j^i$ means $Code_1^i, Code_2^i, Code_3^i, Code_4^i = A^4, B^4, C^4, D^4$ where $j = 4$

$$\prod Code_j^i \times \sum \text{Syn_seg_}\#0 = (4 \times 4 \times 4 \times 4) \times 4 = 1024$$

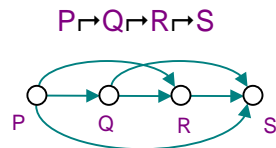
$$\max[\prod Code_{j-1}^i] \times \sum \text{Syn_seg_}\#1 = (4 \times 4 \times 4) \times 12 = 768$$

$$\max[\prod Code_{j-2}^i] \times \sum \text{Syn_seg_}\#2 = (4 \times 4) \times 12 = 192$$

5. Sequential Pattern

- Correlative intersect cases

Mutual Relationships among 4 Sequential Events



PQ-PR-PS-QR-QS-RS

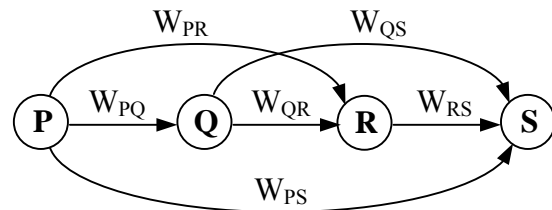
Reference: PQ →0, PR →1, PS →2,
QR →3, QS →4, RS →5.

Codes of Position (p)

$$pos1 = p+1 = P \rightarrow Q = Q \rightarrow R = R \rightarrow S.$$

$$pos2 = p+2 = P \rightarrow R = Q \rightarrow S.$$

$$pos3 = p+3 = P \rightarrow S.$$



Total possible cases of sequential sequences:

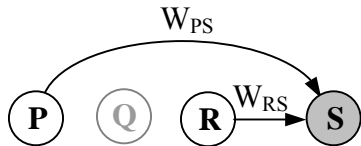
$$\sum S_{seq} = \sum_{w=0}^{n-2} (n-w) \times \binom{n-1}{w} \quad \text{where} \quad \begin{array}{l} n \text{ is number of time-series} \\ w \text{ is numbers of wild card} \end{array}$$

e.g. $n = 4$,

$$\sum S_{seq} = \sum_{w=0}^{n-2} (n-w) \times \binom{n-1}{w} = 4 \times \binom{4}{0} + 3 \times \binom{4}{1} + 2 \times \binom{4}{2} = 4 \times 1 + 3 \times 3 + 2 \times 3 = 19$$

$$\sum S_{seq_#w} = (n-w) \times \binom{n-1}{w} = (n-w) \times \frac{(n-1)!}{w!(n-w-1)!}$$

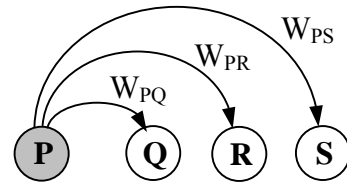
• Local maximal sequencing



Optimal Sequential Sequence

$$P_t \rightarrow R_{t+2} \rightarrow S_{t+3}$$

• Global maximal sequencing

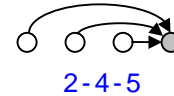
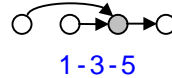
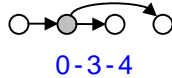
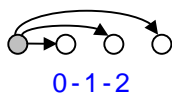


Optimal Sequential Sequence

$$P_t \rightarrow Q_{t+1} \rightarrow R_{t+2} \rightarrow S_{t+3}$$

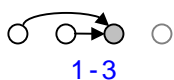
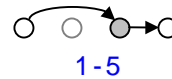
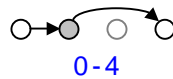
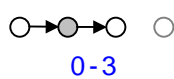
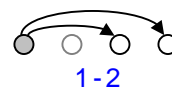
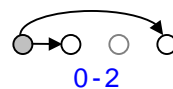
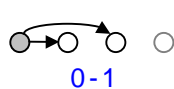
Possible Correlative Event Relationships among 4 Sequential Events

$$\sum S_{seq_#0} = (4-0) \times \frac{(4-1)!}{0!(4-0-1)!} = 4 \times \frac{3!}{3!} = 4 \times 1 = 4$$



Possible Correlative Event Relationships among 3 Sequential Events

$$\sum S_{seq_#1} = (4-1) \times \frac{(4-1)!}{1!(4-1-1)!} = 3 \times \frac{3!}{1!2!} = 3 \times 3 = 9$$



Maximum numbers of sequential sequences:

$Code_j^i$ means $Code_1^i, Code_2^i, Code_3^i, Code_4^i = A^4, B^4, C^4, D^4$ where $j = 4$

$$(\sum Code_j^i)^n \times \sum S_{seq_#0} = (4+4+4+4)^4 \times 4 = 65536 \times 4 = 262144$$

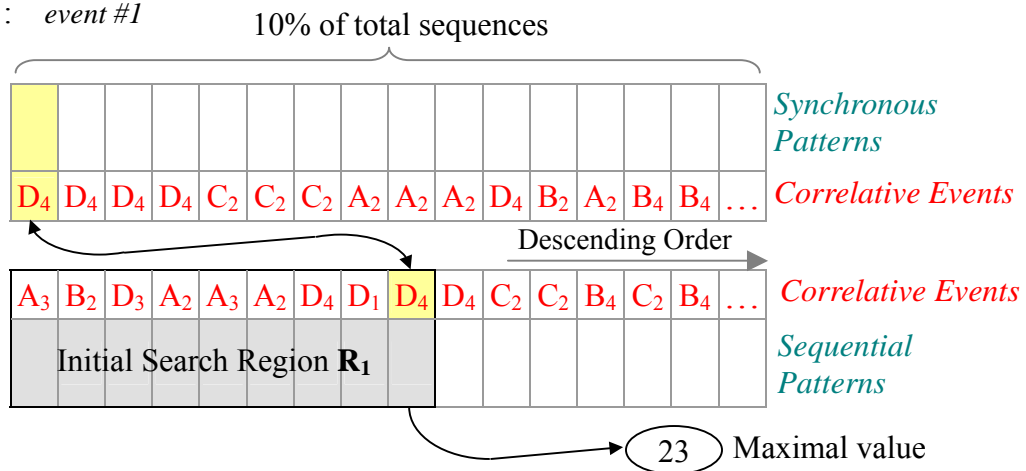
$$(\sum Code_j^i)^{n-1} \times \sum S_{seq_#1} = (4+4+4+4)^3 \times 9 = 4096 \times 9 = 36864$$

$$(\sum Code_j^i)^{n-2} \times \sum S_{seq_#2} = (4+4+4+4)^2 \times 6 = 256 \times 6 = 1536$$

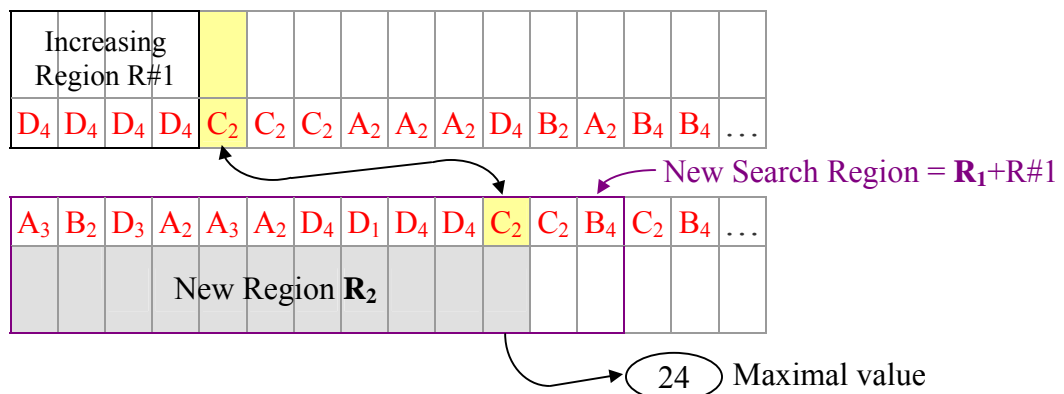
6. Combine Synchronous and Sequential Pattern

- Shorten Search Region Algorithm

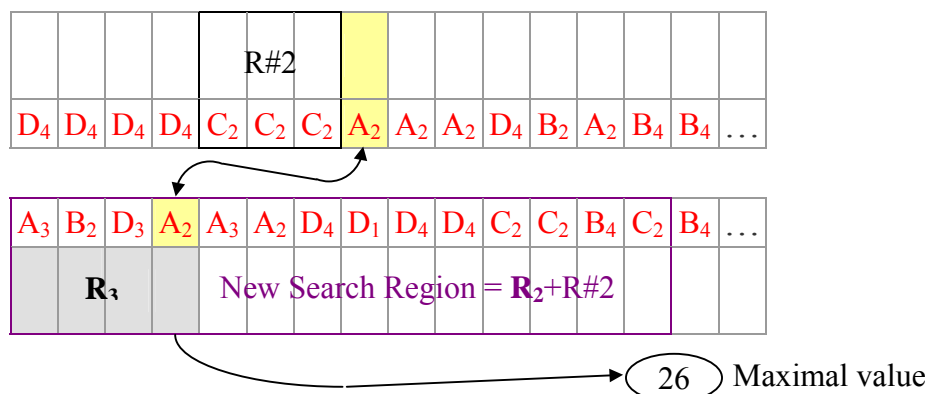
Step 1: *event #1*



Step 2: *event #2*



Step 3: *event #3*



• Shorten Search Region Algorithm

```

1: Search_Region(  $search\_region$ ,  $match\_syn$  )
2: { for  $next\_syn \in syn E_1^4 C \S(\mathit{memory}\#syn)$  do
3:   if ( $max\_syn E_1^4 C \S(\mathit{max}\#syn) == seq E_1^4 C \S(\#next\_syn)$ )
4:     {  $match\_syn \leftarrow \#next\_syn$ ;
5:        $match\_seq \leftarrow search\_region + \#Region(weight(\#next\_syn) - weight(\mathit{match}\#syn))$ ;
6:     }
7: }
```

```

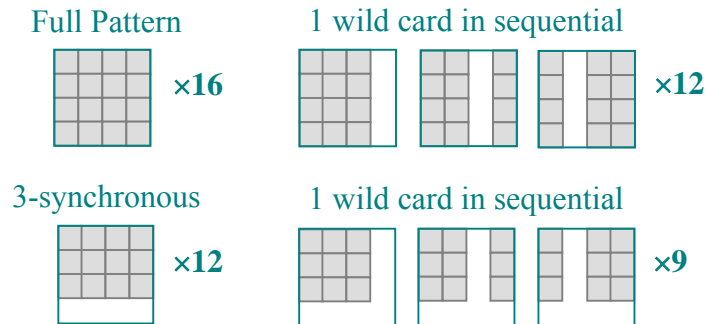
1: Corr_Event_Match(  $max\_weight$ ,  $match\_syn$ ,  $match\_seq$  )
2: { for  $next\_seq \in match\_seq$  do
3:   if ( $max\_syn E_1^4 C \S(\mathit{match}\#syn) == seq E_1^4 C \S(\#next\_seq)$ )
4:     { if ( $(weight(\mathit{match}\#syn) + weight(\#next\_seq)) \geq max\_weight$ )
5:       {  $max\_weight \leftarrow weight(\mathit{max}\#syn) + weight(\mathit{max}\#seq)$ ;
6:          $max\_seq \leftarrow \#next\_seq$ ;
7:          $max\_syn \leftarrow match\_syn$ ;
8:       }
9:        $next\_seq \leftarrow match\_seq$ ;
10:    }
11: }
```

```

1: Shorten_Search_Region(  $syn\_wt$ ,  $syn E_1^4 C \S$ ,  $E_4^4 \Downarrow$ ,  $seq\_wt$ ,  $seq E_1^4 C \S$ ,  $E_4^4 \mapsto$  )
2: {  $max\_syn E_1^4 C \S(\mathit{max}\#syn) \leftarrow syn E_1^4 C \S \#1$ ;
3:    $max\_seq E_1^4 C \S(\mathit{max}\#seq) \leftarrow seq E_1^4 C \S \#1$ ;
4:    $search\_region \leftarrow total\# E_4^4 \mapsto$ ;
5:    $memory\_syn \leftarrow 1$ ;
6:    $match\_syn \leftarrow 1$ ;
7:   while ( $(memory\_syn \leq total\# E_1^4 \Downarrow) \vee (match\_syn \geq total\# E_4^4 \Downarrow)$ ) do
8:     { Search_Region(  $search\_region$ ,  $match\_syn$  );
9:       Corr_Event_Match(  $max\_weight$ ,  $match\_syn$ ,  $match\_seq$  );
10:       $match\_syn++$ ;
11:    }
12:    $M_{1Seq_4}(t) \leftarrow \{E_4^4 \Downarrow \S(\mathit{max}\#syn)\} \cap \{E_4^4 \mapsto \S(\mathit{max}\#seq)\}$ 
13: }
```


7. Information Gain of Pattern

- 4×4 Pattern contents wild cards (Information Gain dependence on numbers of events)



8. Model Implementation

- Model Testing

Linear congruential randomization (uniform distribution) is:

$$\{x_n^i \mid x^i \in \{1 \leq x^i \leq 6\} \text{ and } x_1, x_2, \dots, x_n \mid n = 1000\}$$

e.g. Throw 3 times of 4 dices (dice A, B, C and D, with 6-sided block of each).

The multi-sequence is $\{(A_1 B_6 C_3 D_2), (A_3 B_4 C_5 D_1), (A_6 B_2 C_4 D_3)\}$

```

1: Algorithm LCR_Dataset
2: Output: Four text files contains  $\{x_n^i \mid x^i \in \{1 \leq x^i \leq 4\} \text{ and } x_1, x_2, \dots, x_n \mid n = 1000\}$ 
3: void
4: { for FileName  $\in$  nos_of_file do
5:   { for i  $\in$  file_length / 4 do
6:      $\forall x_i \leftarrow \{x_1, x_2, x_3, x_4 \mid x_i = (1, 2, 3, 4)\}$ ;
7:     Generate 1000 LCR random number  $\forall x \in \{0 \leq x \leq 32767\}$ ;
8:     position[x_n]  $\leftarrow$  x;   sort[x_n]  $\leftarrow$  x;   // Created duplicate code list for sorting
9:     Bubble sorting of random number sort[x_n];
10:    for j  $\in$  file_length do
11:      for k  $\in$  file_length do
12:        if sort[j] = position[k]
13:          { sequence[j]  $\leftarrow$  x_k; // Insert code into sorted list follow random sequence
14:            x_k  $\leftarrow$  0; // Avoid duplicate in sorted list by clearing memory
15:            k  $\leftarrow$  file_length; // Break the looping
16:          }
17:    fileOutput "FileName"  $\leftarrow$  sequence[x_n];
18:  }
19: }
```

- Loss Extra-relationship Pattern

If the output multi-sequence pattern contents more than 70% of intra-relationship in sequential sequence,

then Let weight = 0 (intra-relationship > 70%), and find a new optimal sequential sequence
OR Given constraints to find an additional extra-relationship sequential sequence.

• **Real-life application: (Stock Market Behaviour example)**

Primary Meta-code → Simple and Identical attribute, higher contribution in two events.

A = Today HSI Futures value – Yesterday HSI Futures value = $F(t) - F(t-1)$

$F_1 = (0 < A)$ $F_2 = (A < 0)$ $F_3 = \neg(F_1 \vee F_2)$ ‘ F_3 ’ seldom happened in real stock market

B = Today HSI value – Yesterday HSI value = $H(t) - H(t-1)$

$H_1 = (0 < B)$ $H_2 = (B < 0)$ $H_3 = \neg(H_1 \vee H_2)$ ‘ H_3 ’ does not happen in real stock market

D = HSI Futures value – Today HSI value = $H(t) - F(t)$

$I_1 = (0 < D)$ $I_2 = (D < 0)$ $I_3 = \neg(I_1 \vee I_2)$ ‘ I_3 ’ does not happen in real stock market

C = (Turnover / Capitalisation) 100% $P = C(t) - C(t-1)$

$T_1 = (0 < P)$ $T_2 = (P < 0)$ $T_3 = \neg(T_1 \vee T_2)$ ‘ T_3 ’ does not happen in real stock market

HSI Futures	3*			1
HSI				
HSI & Futures	2		2	
Turnover	2			
	t+1	t+2	t+3	t+4

$$\begin{pmatrix} 3* & 0 & 0 & 1 \\ 0 & 0 & 0 & 0 \\ 2 & 0 & 2 & 0 \\ 2 & 0 & 0 & 0 \end{pmatrix} = M \begin{matrix} \Downarrow(F_3 * I_2 T_2) \Downarrow I_2 \Downarrow F_1 \\ \mapsto (t_1 t_3 t_4) \end{matrix}$$

where * is the correlative event

The pattern (Year 2003-2006) states that “Two days ago, the Turnover was down, HSI Futures was unchanged, and foresaw the HSI will be down in the future. Today the investors foresee HSI will be going down. But HSI Futures values are going up tomorrow”.

Short-term Patterns

Year 2003 is $M \begin{matrix} \Downarrow(F_3 * I_1 T_2) \Downarrow T_2 \Downarrow T_2 \\ \mapsto (t_1 t_2 t_3) \end{matrix}$ Year 2004 is $M \begin{matrix} \Downarrow I_1 \Downarrow I_1 \Downarrow (I_1 * F_1 H_1) \Downarrow I_1 \\ \mapsto (t_1 t_2 t_3 t_4) \end{matrix}$

Year 2005 is $M \begin{matrix} \Downarrow I_1 \Downarrow I_1 \Downarrow (I_1 * F_1 H_1) \Downarrow I_1 \\ \mapsto (t_1 t_2 t_3 t_4) \end{matrix}$ Year 2006 is $M \begin{matrix} \Downarrow I_2 \Downarrow (I_2 * F_2 H_2) \Downarrow I_2 \\ \mapsto (t_1 t_3 t_4) \end{matrix}$

• **Secondary Meta-code example: Financial Market Behaviour (Similar attributes)**

E = HKD-EUR Rate Up J = HKD-JPY Rate Up

$F_1 = E \wedge J$ $F_2 = E \wedge \neg J$ $F_3 = \neg E \wedge J$ $F_4 = \neg E \wedge \neg J = \neg(E \vee J)$

t = Today HSI value – Yesterday HSI value f = HSI Futures value – Today HSI value

U = Up D = Down $E = \neg(U \vee D)$ ‘E’ does not happen in real financial market

$I_1 = U_t \wedge U_f$ $I_2 = U_t \wedge D_f$ $I_3 = D_t \wedge U_f$ $I_4 = D_t \wedge D_f$

C = (Turnover / Capitalisation) 100% $P = C(t) - C(t-1)$ $A = 0.3\%$

$T_1 = (C < A) \wedge (0 < P)$ $T_2 = (A \leq C) \wedge (0 < P)$ $T_3 = (C < A) \wedge (P \leq 0)$ $T_4 = (A \leq C) \wedge (P \leq 0)$

m = 1-month Yield n = 10-year Yield $M = m(t) - m(t-1)$ $N = n(t) - n(t-1)$

U = Up D = Down $E = \neg(U \vee D)$

$Y_1 = U_M \wedge U_N$ $Y_2 = U_M \wedge \neg U_N$ $Y_3 = D_M \wedge U_N$ $Y_4 = D_M \wedge \neg U_N$ $Y_5 = E_M$

All the indicators are selected from year 2003 to 2006.

Long-term Pattern of extra-relationship is $M \begin{matrix} \Downarrow I_1 \Downarrow T_2 \Downarrow (F_3 I_3 T_4 *) \\ \mapsto (t_1 t_2 t_3) \end{matrix}$

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• Notation and Abbreviations

- Syn_j^i Synchronous *Syn* events of different codes *i* in each series and nos. of series *j*
- ${}_u Seq_v$ Sequential *Seq* events from time *u* to *v*
- M_{Seq}^{Syn} Multi-sequence *M* with synchronous and sequential sequence
- E_m^n Event *E*, which contents nos. of different codes *m* in *n* series
- \cap or \wedge And
- \cup or \vee Or
- \times or \square Wild Card
- \rightarrow or \mapsto Event (*t*+1) followed time (*t*)
- \neg Not
- $\overset{\circ}{\sim}$ Mutual Relationship at same time (Synchronous)
- \Rightarrow Associate to
- \S Relationship
- $^E \S$ Extra-Relationship
- $^C \S$ Correlative event
- $\#$ Number
- \in belongs to
- $|$ such that
- \forall for all
- \exists there exists
- \triangle Operator

```

1: Local_Maximal_Segment( weights,  $\updownarrow E_j^2$  )
2: { for i  $\in$  number_of_file do
3:   _FileName  $\leftarrow$  {  $x_i y_i \mid x_i \in \{ \_A, \_B, \_C, \_D \}, y_i \in \{ A, B, C, D \} \}$ ;
4:   while (!fileInput.eof( ))
5:     { fileInput  $\gg$  Weight[i][n]  $\leftarrow$  {  $w_n \mid w_n \in \text{real number} \}$ ;
6:     fileInput  $\gg$  Event#1[i][n]  $\leftarrow$  {  $x_n y_n \mid x_n \in \{ A, B, C, D \}, y_n \in \{ 1, 2, 3, 4 \} \}$ ;
7:     fileInput  $\gg$  Event#2[i][n]  $\leftarrow$  {  $x_n y_n \mid x_n \in \{ A, B, C, D \}, y_n \in \{ 1, 2, 3, 4 \} \}$ ;
8:     Length[n]  $\leftarrow$  n++;
9:   }
10:   Create lookup table for local synchronous relationship of three events
11:   Assigned variables Correlative_Event, Link#1 and Link#2 from lookup table
12:   for j  $\in$  Length[Link#1] do
13:     for k  $\in$  Length[Link#2] do
14:       if ( Correlative_Event[Link#1][j] = Correlative_Event[Link#2][k] )
15:         { Store the weight into memory }
16:   Bubble sort of positive weights only
17:   fileOutput “FileName”  $\leftarrow$   $\updownarrow E_j^3$ ;
18: }

```

```

1: Global_Maximal_Segment( weights,  $\updownarrow E_i^2$  )
2: { for i  $\in$  number_of_file do
3:   _FileName  $\leftarrow$  {  $x_i y_i \mid x_i \in \{ \_A, \_B, \_C, \_D \}, y_i \in \{ A, B, C, D \} \}$ ;
4:   while (!fileInput.eof( ))
5:     { Input Event#1( weights, {  $x_n y_n \mid x_n \in \{ A, B, C, D \}, y_n \in \{ 1, 2, 3, 4 \} \}$  );
6:     Input Event#2( weights, {  $x_n y_n \mid x_n \in \{ A, B, C, D \}, y_n \in \{ 1, 2, 3, 4 \} \}$  );
7:   }
8:   Create lookup table for global synchronous relationship of four events
9:   Assigned variables cor_event, link#1, link#2 and link#3 from lookup table
10:   for i  $\in$  numbers_of_link#1 do
11:     for j  $\in$  numbers_of_link#2 do
12:       for k  $\in$  numbers_of_link#3 do
13:         if  $\exists$  ( cor_event_link#1[i]  $\wedge$  cor_event_link#2[j]  $\wedge$  cor_event_link#3[k] )
14:           { weights  $\leftarrow$  weight_link#1[i] + weight_link#2[j] + weight_link#3[k];
15:           {  $x_n y_n \mid x_n \in \{ A, B, C, D \}, y_n \in \{ 1, 2, 3, 4 \} \}$ ;
16:         }
17:   Bubble sort of positive weights only
18:   fileOutput “FileName”  $\leftarrow$  ( weights,  $\updownarrow E_i^4$  )
19: }

```