

Algorithm 1 HON+ rule extraction algorithm. Given the raw sequential data T , extracts arbitrarily high orders of dependencies, and output the dependency rules R . Optional parameters include $MaxOrder$, $MinSupport$, and $ThresholdMultiplier$

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1: define global  $C$  as nested counter
2: define global  $D, R$  as nested dictionary
3: define global  $SourceToExtSource$ ,  $StartingPoints$  as dictionary
4:
5: function EXTRACTRULES( $T$ , [ $MaxOrder$ ,  $MinSupport$ ,  $ThresholdMultiplier = 1$ ])
6:   global  $MaxOrder$ ,  $MinSupport$ ,  $Aggressiveness$ 
7:   BUILDFIRSTORDEROBSERVATIONS( $T$ )
8:   BUILDFIRSTORDERDISTRIBUTIONS( $T$ )
9:   GENERATEALLRULES( $MaxOrder$ ,  $T$ )
10:
11: function BUILDFIRSTORDEROBSERVATIONS( $T$ )
12:   for  $t$  in  $T$  do
13:     for ( $Source, Target$ ) in  $t$  do
14:        $C[Source][Target] += 1$ 
15:        $IC.add(Source)$ 
16:
17: function BUILDFIRSTORDERDISTRIBUTIONS( $T$ )
18:   for  $Source$  in  $C$  do
19:     for  $Target$  in  $C[Source]$  do
20:       if  $C[Source][Target] < MinSupport$  then
21:          $C[Source][Target] = 0$ 
22:       for  $Target$  in  $C[Source]$  do
23:         if  $thenC[Source][Target] > 0$ 
24:            $D[Source][Target]$ 
25:            $C[Source][Target] / (\sum C[Source][*])$ 
26: function GENERATEALLRULES( $MaxOrder$ ,  $T$ )
27:   for  $Source$  in  $D$  do
28:     ADDTORULES( $Source$ )
29:     EXTENDRULE( $Source$ ,  $Source$ , 1,  $T$ )
30:
31: function KLDTHRESHOLD( $NewOrder, ExtSource$ )
32:   return  $ThresholdMultiplier \times NewOrder / \log_2(1 + \sum C[ExtSource][*])$ 
33: function EXTENDRULE( $Valid$ ,  $Curr$ ,  $order$ ,  $T$ )
34:   if  $Order \leq MaxOrder$  then
35:     ADDTORULES( $Source$ )
36:   else
37:      $Distr = D[Valid]$ 
38:     if  $-\log_2(\min(Distr[*].vals)) < KLDTHRESHOLD(order + 1), Curr$  then
39:       ADDTORULES( $Valid$ )
40:   else
41:      $NewOrder = order + 1$ 
42:      $Extended = EXTENDSOURCE(Curr)$ 
43:     if  $Extended = \emptyset$  then
44:       ADDTORULES( $Valid$ )
45:   else
46:     for  $ExtSource$  in  $Extended$  do
47:        $ExtDistr = D[ExtSource]$ 
48:        $divergence = KLD(ExtDistr, Distr)$ 
49:       if  $divergence > KLDTHRESHOLD(NewOrder, ExtSource)$  then
50:         EXTENDRULE( $ExtSource$ ,  $ExtSource$ ,  $NewOrder$ ,  $T$ )
51:       else
52:         EXTENDRULE( $Valid$ ,  $ExtSource$ ,  $NewOrder$ ,  $T$ )

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Algorithm 1 (continued)

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53: function ADDTORULES( $Source$ ):
54:   for  $order$  in  $[1..len(Source) + 1]$  do
55:      $s = Source[0 : order]$ 
56:     if not  $s$  in  $D$  or  $len(D[s]) == 0$  then
57:       EXTENDSOURCE( $s[1:]$ )
58:     for  $t$  in  $C[s]$  do
59:       if  $C[s][t] > 0$  then
60:          $R[s][t] = C[s][t]$ 
61:
62: function EXTENDSOURCE( $Curr$ )
63:   if  $Curr$  in  $SourceToExtSource$  then
64:     return  $SourceToExtSource[Curr]$ 
65:   else
66:     EXTENDOBSERVATION( $Curr$ )
67:     if  $Curr$  in  $SourceToExtSource$  then
68:       return  $SourceToExtSource[Curr]$ 
69:     else
70:       return  $\emptyset$ 
71:
72: function EXTENDOBSERVATION( $Source$ )
73:   if  $length(Source) > 1$  then
74:     if not  $Source[1:]$  in  $ExtC$  or  $ExtC[Source] = \emptyset$  then
75:       EXTENDOBSERVATION( $Source[1:]$ )
76:    $order = length(Source)$ 
77:   define  $ExtC$  as nested counter
78:   for  $Tindex, index$  in  $StartingPoints[Source]$  do
79:     if  $index - 1 \leq 0$  and  $index + order < length(T[Tindex])$  then
80:        $ExtSource = T[Tindex][index - 1 : index + order]$ 
81:        $ExtC[ExtSource][Target] += 1$ 
82:        $StartingPoints[ExtSource].add((Tindex, index - 1))$ 
83:   if  $ExtC = \emptyset$  then
84:     return
85:   for  $S$  in  $ExtC$  do
86:     for  $t$  in  $ExtC[S]$  do
87:       if  $ExtC[S][t] < MinSupport$  then
88:          $ExtC[S][t] = 0$ 
89:        $C[s][t] += ExtC[S][t]$ 
90:        $CsSupport = \sum ExtC[S][*]$ 
91:     for  $t$  in  $ExtC[S]$  do
92:       if  $ExtC[S][t] > 0$  then
93:          $D[s][t] = ExtC[S][t] / CsSupport$ 
94:          $SourceToExtSource[s[1:]].add(s)$ 
95:
96: function BUILDSOURCETOEXTSOURCE( $order$ )
97:   for  $source$  in  $D$  do
98:     if  $len(source) = order$  then
99:       if  $len(source) > 1$  then
100:          $NewOrder = len(source)$ 
101:         for  $startingin[1..len(source)]$  do
102:            $curr = source[starting:]$ 
103:           if not  $curr$  in  $SourceToExtSource$  then
104:              $SourceToExtSource[curr] = \emptyset$ 
105:           if not  $NewOrder$  in  $SourceToExtSource[curr]$  then
106:              $SourceToExtSource[curr][NewOrder] = \emptyset$ 
107:              $SourceToExtSource[curr][NewOrder].add(source)$ 

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