



Chain-based DFA Deflation

—— Novel Approaches for Fast and Scalable Regular Expression Matching



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Outline



Background

- Significance
 - why research regular expression (regex) matching?
- Challenges
 - can we solve the problems of regex matching?
- Motivation
 - Observation
 - the feature of DFA (Deterministic Finite Automaton)
- Algorithms
 - □ Inside chain
 - \bullet D²FA, A-DFA
 - FEACAN, Cluster-DFA, RCDFA
 - □ Inside chain & inter chain
 - Chain-based DFA deflation
 - Conclusion



Background: Why Regular Expressions Acceleration?



- Regular expressions are now widely used
 - firewalls, filtering, authentication and monitoring

 - layer 7 switches, traffic billing, load balancing atching! content-based traffic management and it and it and its and
- Regular expression matchi
 - space: large amount of orlinor
 - state traversal per input character
- ession matching is performance bottleneck
 - rprise switches from Cisco, etc
 - Cisco security appliances
 - Use DFA, 1+ GB memory, still sub-gigabit throughput





Background: Any way to do Regular **Expression Matching Better?**



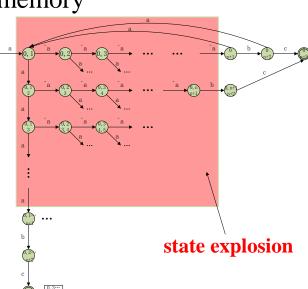
- Construction time versus execution time
 - also, there may be thousands of regular expressive patterns

 FAs are fast

 but can have exponentially large fumber of states

 algorithms exist to min.
- DFAs are fast

 - algorithms exist to mirars to number of states
 - ice and 2) gigabytes of memory
- e high performance?
- /FPGA/TCAM
 - on-chip memory unit provides ample bandwidth
 - pipelining and parallelism
 - but volume is precious



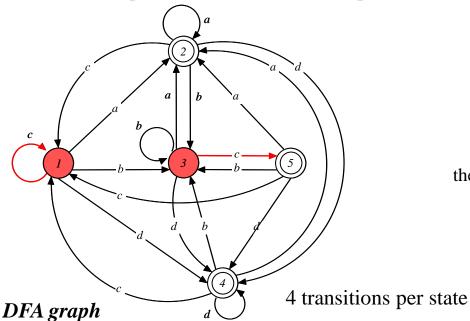




Background: Motivation



- How to represent DFA more compactly?
 - **a** cannot reduce the number of states
 - □ how about reducing the number of transitions?
 - every state is consist of 256 next-hop transitions
 - if use a byte to represent a state ID, then need 256 bytes per state
 - state similarity: almost every state can share the same next-state transitions with multiple other states for most input characters (real world datasets)



RegEx: a+, b+c, c*d+

Look at state pairs: there are many **common transitions**. How to remove them?



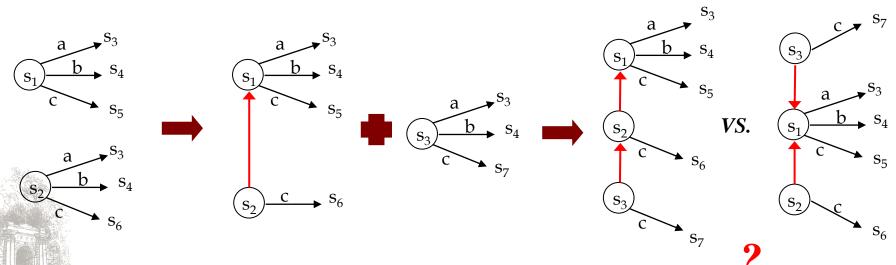


Algorithm: D²FA



Delay input DFA

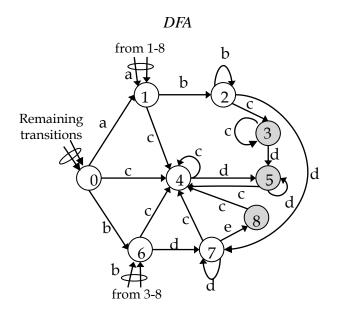
- □ introduce *default transition*
 - remove the common transitions between states
 - but introduce one more memory access if default transition is taken
 - aim to remove as many transitions as possible, and make as less default transitions as possible per input character

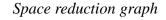


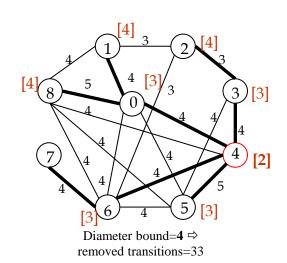


Algorithm: D²FA Construction

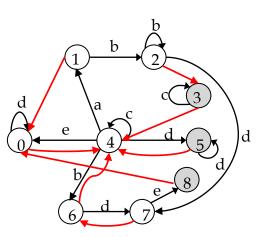




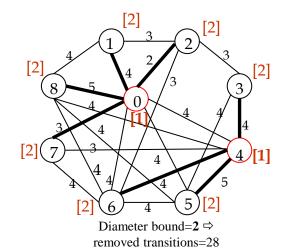




 D^2FA



RegEx: ab^+c^+ , cd^+ and bd^+e



Traversal time=O((D/2+1)N)
Time complexity=O(n²logn)
Space complexity=O(n²)



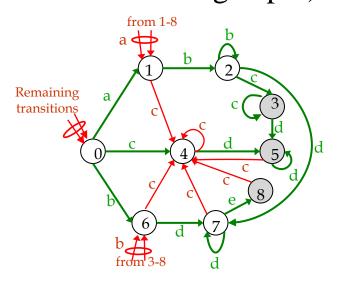


Algorithm: A-DFA



□ Advanced D²FA

- □ introduce backwards default transition
 - most transitions are backwards transitions
 - orient default transitions only backwards (towards decreasing depth)



RegEx: ab^+c^+ , cd^+ and bd^+e

- □ Forward transitions:
 - Matches
 - State specific
- Backward transitions:
 - Mismatch
 - Shared by multiple states

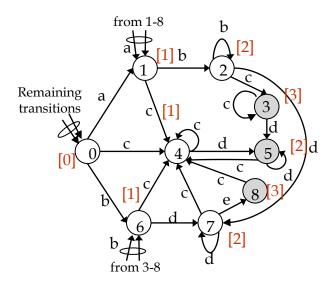




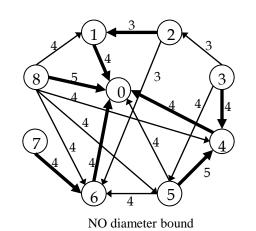
Algorithm: A-DFA Construction





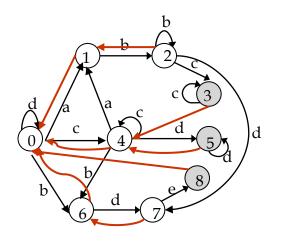


Oriented space reduction graph



Time complexity=O(2N) removed transitions=33

A-DFA



RegEx: ab^+c^+ , cd^+ and bd^+e

Traversal time=O(2N)
Time complexity=O(n²)
Space complexity=O(n)





Algorithm: D²FA & A-DFA



□ Pros

- good compression ratio
- good worst-case speed
- worst-case speed
 O(2N) complexity for A-DFAd overcome the cons!

 S

 fficient broker

Cons

- - rministic transition calculation
 - per input character requires comparing all the labeled transitions in current state, before taking the default transition
 - non-deterministic and unbound memory access times per input character
 - transition comparisons are recursively done among all states in the default path, until a non-default transition is found





DFA graph vs. DFA matrix



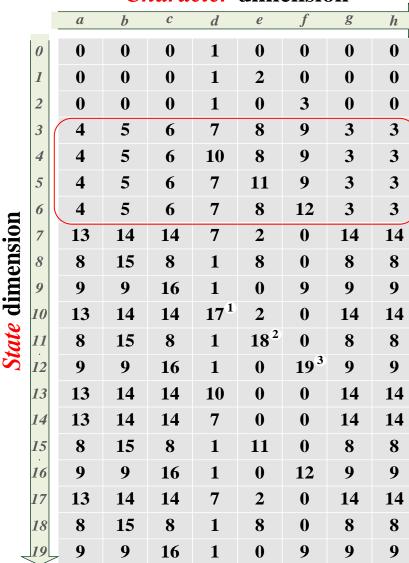
\Box DFA matrix Δ_{N*M}

- regular expressiones
 - def[^ef]*add
 - **2** def[^df]*bee
 - **3** *def*[^*de*]**cff*
- alphabet

$$\square$$
 $\Sigma = \{a,b,c,d,e,f,g,h\}$

$$N = 20, M = |\Sigma| = 8$$

- □ state
- character
- □ (next-state) transition





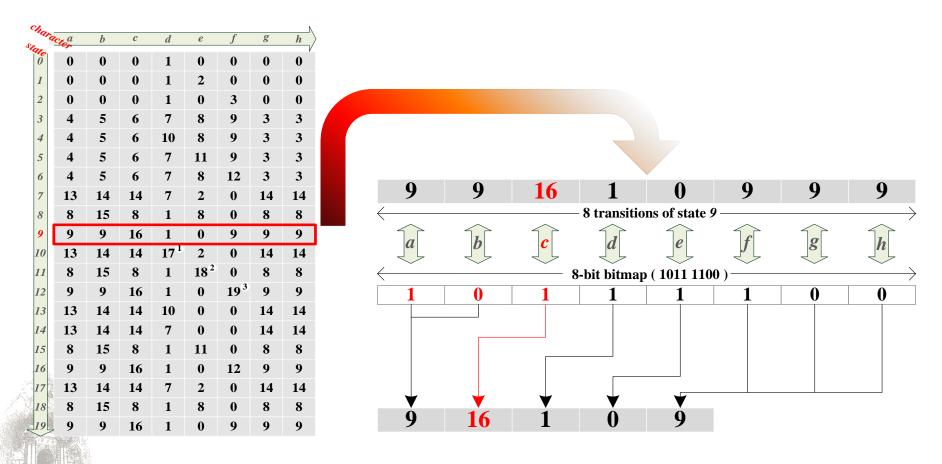


Algorithm cont.



Bitmap technique

Guaranteed deterministic and acceptable memory access



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- □ Compression along the *state* dimension
 - Observation
 - Large redundancy exists among similar states whose distribution is scattered
 - Derived from regular expression characteristic
 - Verified by real-life rule sets
 - Bitmap technique is only effective for consecutively identical transitions

□ Proposal

- Make identical transitions consecutive along the *state* dimension (DFA Reorganization)
- Leverage bitmap technique (DFA Compression)

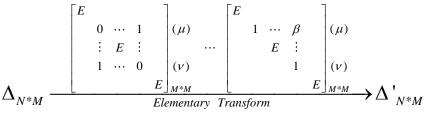






Reorganize DFA

- DFA matrix transform
- \neg Cluster similar states adjacent \triangle_{N*M}



0	0	0	1	0	0	0	0		1	1	1	2	1	13	1	1
0	0	0	1	2	0	0	0		1	1	1	2	1	1	1	1
0	0	0	1	0	3	0	0		1	1	1	2	0	1	1	1
4	5	6	7	8	9	3	3		3	5	3	2	3	1	3	3
4	5	6	10	8	9	3	3		3	5	3	2	3	1	3	3
4	5	6	7	11	9	3	3		3	5	3	2	6	1	3	3
4	5	6	7	8	12	3	3		3	5	3	2	4 2	1	3	3
13	14	14	7	2	0	14	14		7	7	10	2	1	7	7	7
8	15	8	1	8	0	8	8		7	7	10	2	1	7	7	7
9	9	16	1	0	9	9	9		7	7	10	2	1	8 3	7	7
13	14	14	17 ¹	2	0	14	14		7	7	10	2	1	9	7	7
8	15	8	1	18 ²	0	8	8		14	12	11	17	3	9	13	13
9	9	16	1	0	19 ³	9	9		14	12	11	17	6	7	13	13
13	14	14	10	0	0	14	14		14	12	11	17	3	7	13	13
13	14	14	7	0	0	14	14		14	12	11	19	3	7	13	13
8	15	8	1	11	0	8	8		15	16	16	19	1	1	16	16
9	9	16	1	0	12	9	9		15	16	16	17	1	1	16	16
13	14	14	7	2	0	14	14		15	16	16	17	0	1	16	16
8	15	8	1	8	0	8	8		15	16	16	17	0	1	16	16
9	9	16	1	0	9	9	9	/	15	16	16	18 ¹	0	1	16	16



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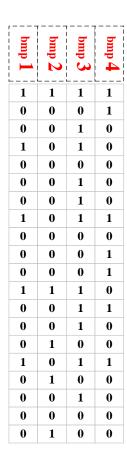


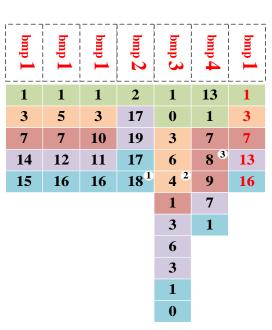


Compress DFA

- □ State Bitmap for primary redundancy among states
- Character Mapping for residual redundancy inside states

<	(MA)	PPIN	G aloı	ng the	chara	acter (limen	$\mathbf{sion} \mathbf{>}$
\uparrow	1	1	1	2	1	13	1	1
						1		
					0			
	3	5	3		3		3	3
ion								
20-bit BITMAP along the state dimension					6			
dim					4 2			
ate	7	7	10	2	1	7	7	7
e st								
g th						8 3		
lon						9		
Pa	14	12	11	17	3		13	13
MA					6	7		
31T					3			
bit 1				19				
20-1	15	16	16		1	1	16	16
				17				
					0			
				18 ¹				





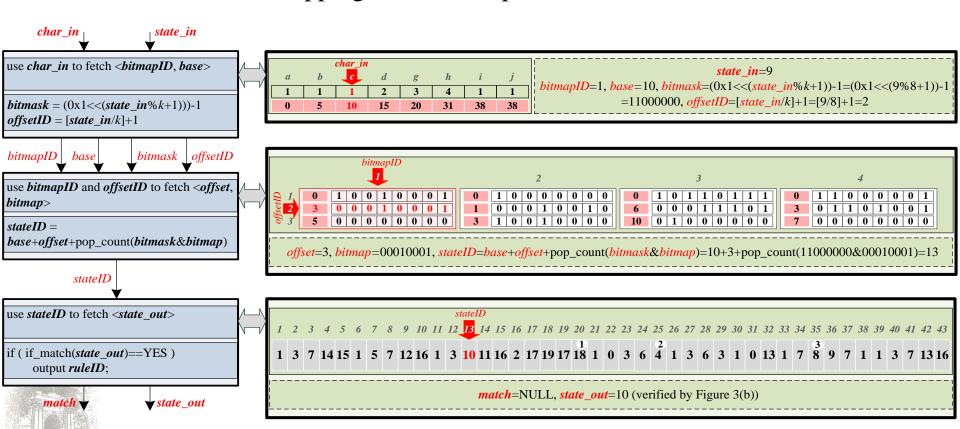




Traversal time=O(N)
Time complexity=O(nlogn)

Space complexity=O(n)

- □ Pipeline mapping architecture
 - □ 3-stage memory access and table lookup
 - Index mapping table, Bitmap table, Transition table



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COMPRESSION RATE (% TRANSITION REDUCTION)

Rule Sets	# OF TRANSITIONS	Bitmap	D ² FA	D ² FA- improved	RCDFA
Snort24.re	2133760	88.87	91.04	98.73	99.01
Snort40.re	4868864	92.10	82.68	98.13	98.89
Bro217.re	1672448	70.91	76.09	98.94	98.57
Linux13.re	1246976	96.17	57.12	27.86	96.56
Linux30.re	11148032	90.84	80.94	34.88	96.79
SnortPart.str	1449472	31.88	83.88	99.21	98.69
SnortAll.str	14407680	17.86	84.11	99.22	98.90

NUMBER OF STATE ACCESSED PER INPUT CHARACTER

Rule Sets	# OF STATES	\mathbf{D}^2	FA	D²FA-i	RCDFA	
		Avg.	Worst	Avg.	Worst	
Snort24.re	8335	1.09	2	1.98	9	1
Snort40.re	19019	1.94	2	1.98	7	1
Bro217.re	6533	1.18	2	1.43	9	1
Linux13.re	4871	1.03	2	1.73	6	1
Linux30.re	43547	1.04	2	1.99	13	1
SnortPart.str	5662	1.39	2	1.74	7	1
SnortAll.str	56280	1.44	2	1.78	10	1

O(*N*log*N*) preprocessing time complexity

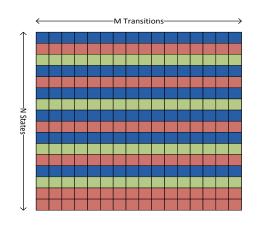


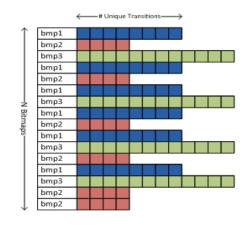


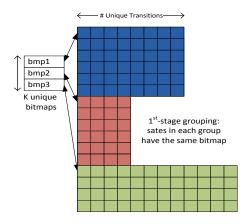
Algorithm: FEACAN

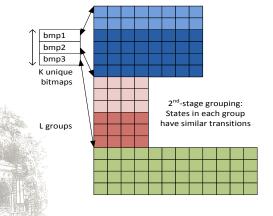


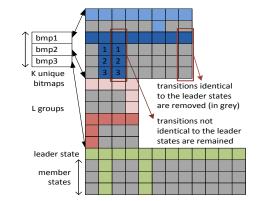
- ✓ 2-D compression
 - ✓ Intra-state compression
 - compress the number of transitions inside each state via bitmap technique
 - ✓ Inter-state compression
 - y group similar states sharing identical bitmaps and encode redundant transitions in each group

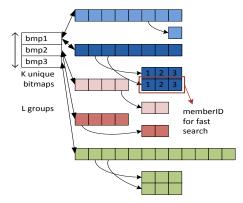












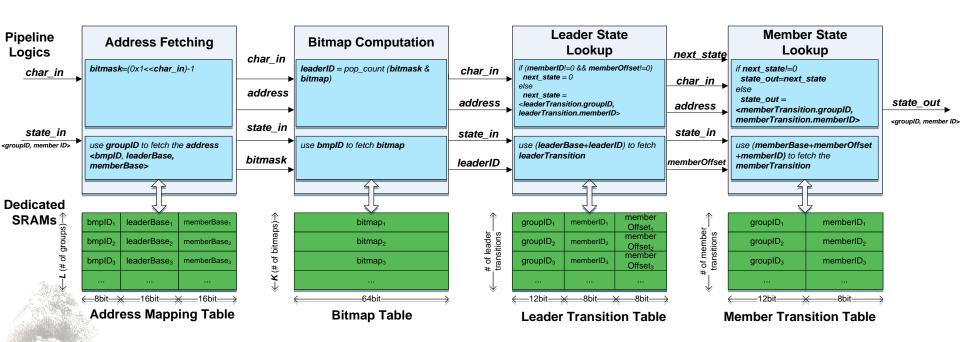
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Algorithm: FEACAN



- □ Pipeline mapping architecture
 - □ 4-stage memory access and table lookup
- Traversal time=O(N)
 Time complexity=O(n²/L)
 Space complexity=O(n)
- Address mapping table, Bitmap table, Leader Transition table,
 Member transition table



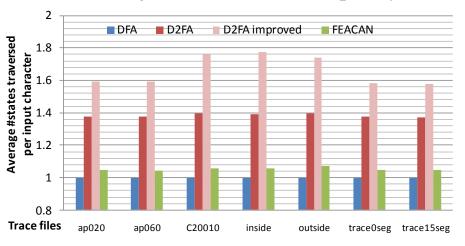
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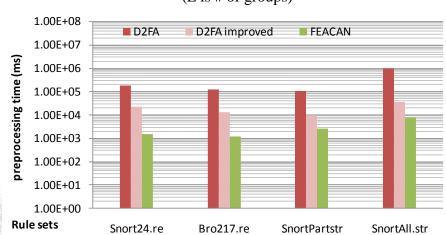
Algorithm: FEACAN



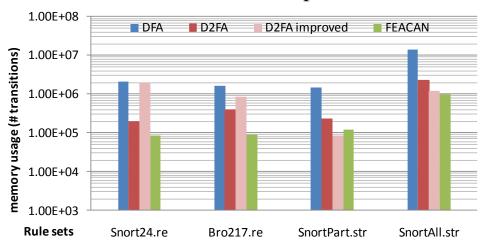
Average 1.03 states access per byte



O(N^2/L) preprocessing time complexity (L is # of groups)



Over 90% trans compression ratio



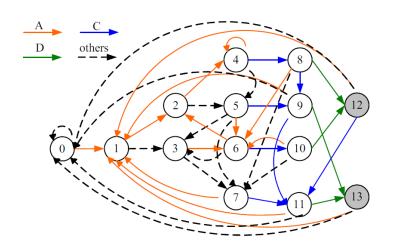
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Cluster-based observation

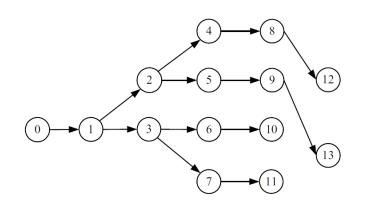
- □ cluster
 - a states set which is composed of all son states of a certain state in the trie-tree



RegEx: *A.{2}CD*

TRANSITION CHARACTERISTIC INSIDE STATES

	average	average	% transitions
pattern set	distinct	distinct	in Top-2
	"next-states"	clusters	clusters
snort-24	14.49	5.06	97.89
snort-31	12.24	4.75	97.92
snort-34	13.11	4.69	98.21
bro-217	54.29	4.23	97.95
type-1	47.79	1.93	99.96



Trie-tree





- Splitting Compression
 - □ split DFA matrix into T1, T2, T3 matrix
 - According to the TOP-2 clusters

State	A	C	D	٨	State	A	С	D	٨		State	A	С	D	٨		State	A	С	D	٨
0	1	0	0	0	0	X	0	0	0		0	1	X	X	X		0	X	X	X	X
1	2	3	3	3	1	2	3	3	3		1	X	X	X	X		1	X	X	X	X
2	4	5	5	5	2	4	5	5	5		2	X	X	X	X		2	X	X	X	X
3	6	7	7	7	3	6	7	7	7		3	X	X	X	X		3	X	X	X	X
4	4	8	5	5	4	4	X	5	5		4	X	8	X	X		4	X	X	X	X
5	6	9	7	7	5	6	X	7	7		5	X	9	X	X		5	X	X	X	X
6	2	10	3	3	6	2	X	3	3	#	6	X	10	X	X	4	6	X	X	X	X
7	1	11	0	0	7	X	X	0	0		7	1	X	X	X		7	X	11	X	X
8	6	9	12	7	8	6	X	X	7		8	X	9	X	X		8	X	X	12	X
9	1	11	13	0	9	X	X	X	0		9	1	X	X	X		9	X	11	13	X
10	6	7	12	7	10	6	7	X	7		10	X	X	12	X		10	X	X	X	X
11	1	0	13	0	11	X	0	X	0		11	1	X	X	X		11	X	X	13	X
12	1	11	0	0	12	X	X	0	0		12	1	X	X	X		12	X	11	X	X
13	1	0	0	0	13	X	0	0	0		13	1	X	X	X		13	X	X	X	X
DF	A 1	ma	ıtri	X	T1	m	at	rix			T2	m	nat	rix			T3	m	at	rix	







Cluster-based Splitting Compression

compress each matrix

bitmap for
T1, T2

sparse matrix compression algorithm for T3

state	A	C	D	^	
0	X	0	0	0	
1	2	3	3	3	
2	4	5	5	5	
3	6	7	7	7	
4	4	X	5	5	
5	6	X	7	7	
6	2	X	3	3	١
7	X	X	0	0	
8	6	X	X	7	
9	X	X	X	0	
10	6	7	X	7	
11	X	0	X	0	
12	X	X	0	0	
13	X	0	0	0	

	state	A	C	D	^	base	
	0	X	0	0	0	0	
	1	0	1	1	1	2	
	2	0	1	1	1	4	
	3	0	1	1	1	6	
	4	0	X	1	1	4	
	5	0	X	1	1	6	
•	6	0	X	1	1	2	\Rightarrow
	7	X	X	0	0	0	
	8	0	X	X	1	6	
	9	X	X	X	0	0	
	10	0	1	X	1	6	
	11	X	0	X	0	0	
	12	X	X	0	0	0	
	13	X	0	0	0	0	

ate	A	C	D	^	base	egual
0	X	0	0	0	0	0
1	0	1	1	1	2	1
					4	1
					6	1
					4	1
					6	1
					2	1
					0	0
					6	1
					0	0
					6	1
					0	0
					0	0
						Ŭ

Algorithm 2 Pseudo-code for getting next state of CSCA for current state cur and the input character c 1: if bitmap[cur][c] == 1 then

return R1[equal1[cur]][c] + base1[cur]

3: else if $(temp = R3[cur][c]) \neq' X'$ then

return temp

5: else

return R2[equal2[cur]][c] + base2[cur]

7: end if





□ Time:

- □ at least 4 memory accesses per input character
 - bitmap, equal1, R1, base1
- Space: Comparison in terms of spatial compression ratio

Group	original	DFA	our c	ompres	ssion algorith	m (CSCA)	SCR of	SCR of
name	n	SCR	n1	n2	r	SCR	δ FA	Default_Row
17 filter-1	3172	1.0	52	22	0.024621	0.070756	0.634964	0.232905
17 filter-3	30135	1.0	3	21	0.011429	0.051420	0.960985	0.356860
17 filter-4	22608	1.0	7	44	0.054823	0.095459	0.097177	0.381078
snort-24	13882	1.0	13	34	0.021074	0.062055	0.037515	0.108468
snort-31	19522	1.0	7	34	0.020840	0.061391	0.053581	0.061309
snort-34	13834	1.0	6	17	0.017938	0.058231	0.032259	0.060473
bro-217	6533	1.0	1	14	0.020456	0.060557	0.061814	0.224820
type-1	249	1.0	1	2	0.000016	0.042212	0.111281	0.186697
type-2	78337	1.0	512	2	0.000102	0.042026	0.099659	0.030254
type-3	8338	1.0	43	5	0.002395	0.043842	0.948123	0.018575
type-4	5290	1.0	236	4	0.012469	0.064080	0.990808	0.046357
type-5	7828	1.0	1	22	0.002451	0.041732	0.947048	0.019762
type-6	14496	1.0	9	22	0.002300	0.042061	0.973929	0.173284

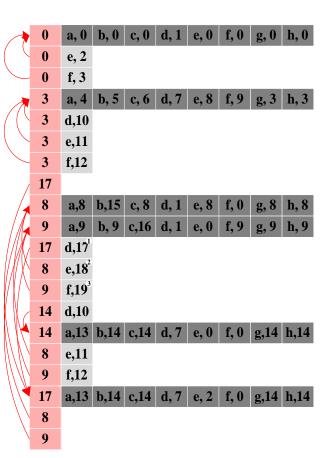


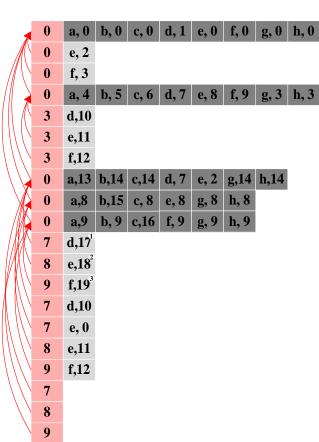


Chain



0	0	0	1	0	0	0	0
0	0	0	1	2	0	0	0
0	0	0	1	0	3	0	0
4	5	6	7	8	9	3	3
4	5	6	10	8	9	3	3
4	5	6	7	11	9	3	3
4	5	6	7	8	12	3	3
13	14	14	7	2	0	14	14
8	15	8	1	8	0	8	8
9	9	16	1	0	9	9	9
13	14	14	17 ¹	2	0	14	14
8	15	8	1	18 ²	0	8	8
9	9	16	1	0	19 ³	9	9
13	14	14	10	0	0	14	14
13	14	14	7	0	0	14	14
8	15	8	1	11	0	8	8
9	9	16	1	0	12	9	9
13	14	14	7	2	0	14	14
8	15	8	1	8	0	8	8
9	9	16	1	0	9	9	9



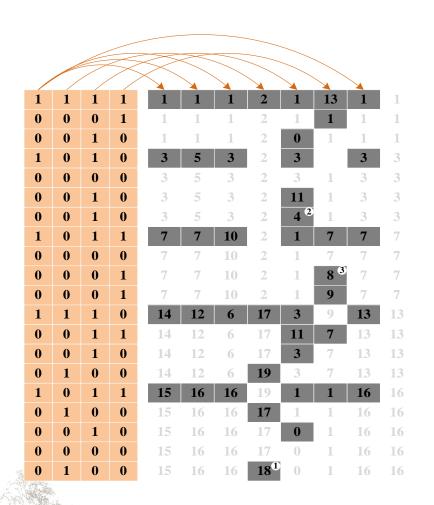


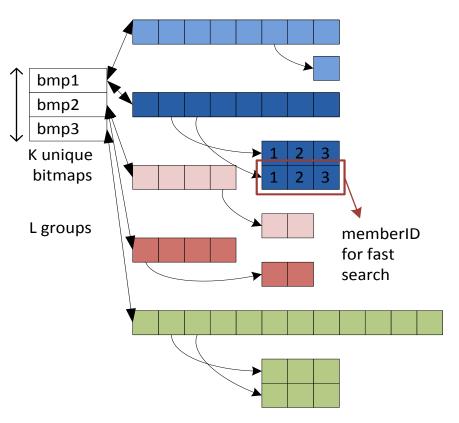


DFA D^2FA A-DFA









RCDFA

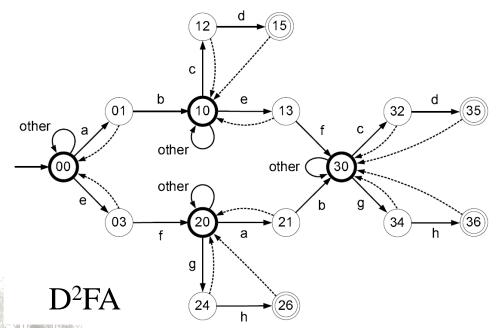
FEACAN



Algorithm: TCAM-based



- □ TID (Template ID)
 - □ chain
- □ PID (Private ID)
 - □ state in each chain



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SRAM

Source	Input		
TID	PID		
1000	001	b	
1000	011	f	
1000	***	a	
1000	***	е	
1000	***	*	
0100	010	d	
0100	011	f	
0100	***	C	
0100	***	е	
0100	***	*	
0010	001	b	
0010	100	h	
0010	***	a	
0010	***	g	
0010	***	*	
0001	010	d	
0001	100	h	
0001	***	С	
0001	***	g	
0001	***	*	

Destination State					
TID	PID				
0100	000				
0010	000				
1111	001				
1111	011				
1111	000				
1111	101				
0001	000				
1111	010				
1111	011				
1111	000				
0001	000				
1111	110				
1111	001				
1111	100				
1111	000				
1111	101				
1111	110				
1111	010				
1111	100				

1111

000



Algorithm: TCAM-based



□ TCAM-based DFA deflation

TCAM

SRAM

Source	Input	
TID	PID	
*0*0	***	а
1000	001	b
0010	001	b
0*0*	***	С
0 * 0 *	010	d
00	*	е
1000	011	f
0100	011	f
00**	* * *	g
00**	100	h
***	***	*

Destination State					
TID	PID				
1111	001				
0100	000				
0001	000				
1111	010				
1111	101				
1111	011				
0010	000				
0001	000				
1111	100				
1111	110				
1111	000				





Algorithm: TCAM-based



Evaluation

Number of TCAM entries used.

	Chen's	Meiners's	Number of	Our	Number of
	method	method	DFA states	method	NFA states
Bro-217	21,872	9,118	6,533	4,659	2,131
Snort-34	34,508	16,293	13,825	2,095	887
Snort-24	38,418	16,144	13,886	5,139	575
Snort-31	72,662	41,487	20,068	9,168	912

Why so many bits?

NUMBER OF BITS USED PER ENTRY.

		Chen's method		Meiners's method		Our method	
		TCAM	SRAM	TCAM	SRAM	TCAM	SRAM
\dashv	Bro-217	26	18	31	23	23	15
	Snort-34	25	17	28	20	70	62
	Snort-24	26	18	26	18	52	44
	Snort-31	26	18	34	26	57	49

Total number of bits used (MegaBit).

	Chen's method		Meiners's method		Our method	
	TCAM	SRAM	TCAM	SRAM	TCAM	SRAM
Bro-217	0.54	0.38	0.27	0.20	0.10	0.07
Snort-34	0.82	0.56	0.44	0.31	0.14	0.12
Snort-24	0.95	0.66	0.40	0.28	0.26	0.22
Snort-31	1.80	1.25	1.35	1.03	0.50	0.43





Conclusion



■ What make the combination of coded transitions efficient?

□ *inside chain* & *outside chain*, previous methods only take

inside chain into account

the same input character and similar coding of TID,
 meanwhile the return state is the template state

 \Box as long as the coding is good enough, the result of RCDFA will be better, maybe $O(|\Sigma|)$

