

Review of:  
**Packet Classification Using  
Multidimensional Cutting**

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## Motivation

- **Importance**
  - QoS and Security
- **Performance of existing schemes**
  - RFC : fast but excessive storage
  - EGT-PC : speed still slow for practical purposes
  - HiCuts : same..
  - TCAM : high power consumption, high cost and less dense
    - Vendors like Cypress, Fast-Chip, EZchip, Integrated Silicon looking for different alternatives
- **New ideas**
  - New ideas still possible
  - Authors introduce one such idea : HyperCuts

## Packet Classification Problem

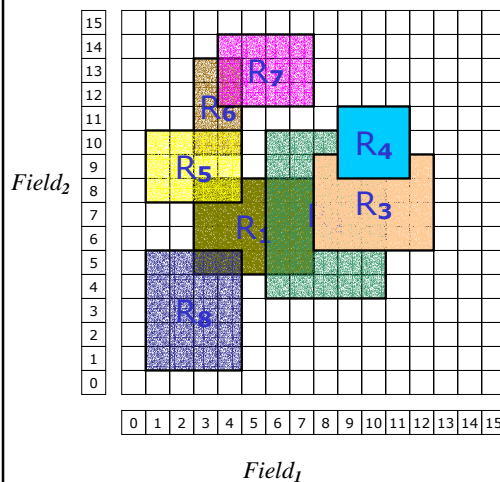
Rule	Field <sub>1</sub>	Field <sub>2</sub>	Field <sub>3</sub>	Field <sub>4</sub>	Field <sub>5</sub>	ACTION
R <sub>0</sub>	000*	111*	10	*	UDP	act <sub>0</sub>
R <sub>1</sub>	000*	111*	01	10	UDP	act <sub>0</sub>
R <sub>2</sub>	000*	10*	*	10	TCP	act <sub>1</sub>
R <sub>3</sub>	000*	10*	*	01	TCP	act <sub>2</sub>
R <sub>4</sub>	000*	10*	10	11	TCP	act <sub>1</sub>
R <sub>5</sub>	0*	111*	10	01	UDP	act <sub>0</sub>
R <sub>6</sub>	0*	111*	10	10	UDP	act <sub>0</sub>
R <sub>7</sub>	0*	1*	*	*	TCP	act <sub>2</sub>
R <sub>8</sub>	*	01*	*	*	TCP	act <sub>2</sub>
R <sub>9</sub>	*	0*	*	01	UDP	act <sub>0</sub>
R <sub>10</sub>	*	*	*	*	UDP	act <sub>3</sub>
R <sub>11</sub>	*	*	*	*	TCP	act <sub>4</sub>

Rule	Field <sub>1</sub>	Field <sub>2</sub>	Field <sub>3</sub>	Field <sub>4</sub>	Field <sub>5</sub>	ACTION
R <sub>0</sub>	0-1	14-15	2	0-3	0	act <sub>0</sub>
R <sub>1</sub>	0-1	14-15	1	2	0	act <sub>0</sub>
R <sub>2</sub>	0-1	8-11	0-3	2	1	act <sub>1</sub>
R <sub>3</sub>	0-1	8-11	0-3	1	1	act <sub>2</sub>
R <sub>4</sub>	0-1	8-11	2	3	1	act <sub>1</sub>
R <sub>5</sub>	0-7	14-15	2	1	0	act <sub>0</sub>
R <sub>6</sub>	0-7	14-15	2	2	0	act <sub>0</sub>
R <sub>7</sub>	0-7	8-15	0-3	0-3	1	act <sub>2</sub>
R <sub>8</sub>	0-15	4-7	0-3	0-3	1	act <sub>2</sub>
R <sub>9</sub>	0-15	0-7	0-3	1	0	act <sub>0</sub>
R <sub>10</sub>	0-15	0-15	0-3	0-3	0	act <sub>3</sub>
R <sub>11</sub>	0-15	0-15	0-3	0-3	1	act <sub>4</sub>

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## Graphical Illustration

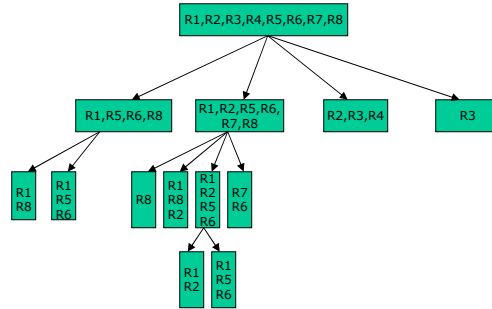
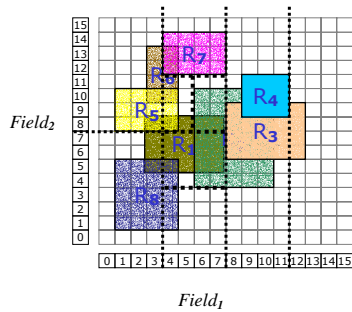


Field <sub>1</sub>	Field <sub>2</sub>	Rule
3-7	5-8	R <sub>1</sub>
6-10	4-10	R <sub>2</sub>
8-12	6-9	R <sub>3</sub>
9-11	9-11	R <sub>4</sub>
1-4	8-10	R <sub>5</sub>
3-4	10-13	R <sub>6</sub>
4-7	12-14	R <sub>7</sub>
1-4	1-5	R <sub>8</sub>

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## Constructing a Decision Tree



- **Goals**
  - Tree with minimal depth
  - With least nodes
  - With uniformly distributed rules in the leaves
  - With reasonably small # of rules in the leaves
- **Questions**
  - How many dimensions to cut at a time?
  - Which dimensions to choose?
  - How many cuts on which dimension?

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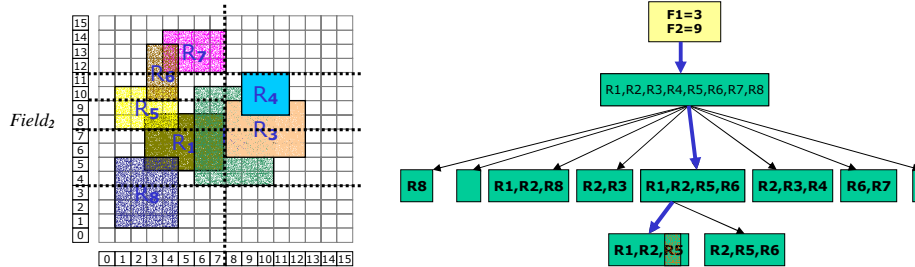
## Hierarchical Cuts (HiCuts)

- **How many fields to cut?**
  - Only one field on one node
- **Which field to cut?**
  - Some heuristics
    - field with maximum unique components specified
    - Minimize the maximum # of rules in a child node
- **How many cuts to make on it?**
  - Some heuristics
    - Total # cuts at each node bounded by  $spmfn(n) = spfac \times n$

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## HyperCuts Illustration

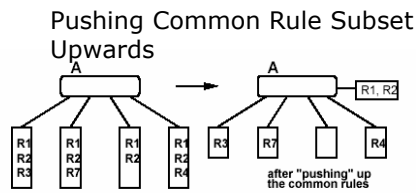
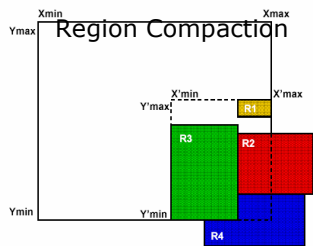
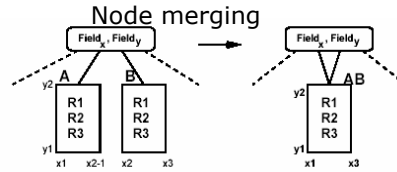
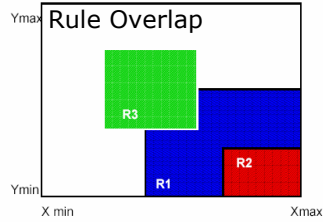


- Key features
  - Tree depth is reduced by cutting multiple fields
  - Navigation through tree is done by array indexing

## HyperCuts

- How many fields to cut?
  - One or more
- Which fields to cut?
  - Some heuristics
    - Field with number of unique elements greater than the mean of the number of unique elements across all the dimensions considered
    - Also experimented with ratio of number of unique elements to the size of that region across the dimension chosen
  - Denote the set of fields to cut on a node by  $D$
- How many cuts to make on each field?
  - Some heuristics
    - Cuts on field  $i = nc(i)$   $i \in D$ , decided by some heuristics
    - Total cuts at one node =  $\prod nc(i) < spfac \times \sqrt{N}$

## Optimizations



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## Results on Core Router Databases

### Memory space requirement

Database	No. Rules	RFC	HiCuts - 4	HiCuts - 1	ABV	EGT - PC	HypCuts - 4	HypCuts - 1
CR <sub>1</sub>	85	55,202	11,608	1,346	1,572	1,168	453	226
CR <sub>2</sub>	125	114,080	10,704	1,986	1,606	1,472	589	610
CR <sub>3</sub>	351	100,991	64,541	19,001	4,651	2,261	15,395	11,210
CR <sub>4</sub>	2799	747,271	117,801	25,543	285,099	30,753	16,631	11,030

### Observed worst case memory accesses

Database	No. Rules	RFC	HiCuts - 4	HiCuts - 1	ABV	EGT - PC	HypCuts - 4	HypCuts - 1
CR <sub>1</sub>	85	12	25	32	111	32	14	14
CR <sub>2</sub>	125	12	25	36	106	54	8	11
CR <sub>3</sub>	351	12	35	57	126	47	22	31
CR <sub>4</sub>	2,799	12	38	66	196	87	18	25

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## Results on Edge Router Databases

### Memory space requirement

Database	No. of Rules	EGT - PC	HiCuts - 4	HiCuts - 1	HyperCuts - 4	HyperCuts - 1
ER <sub>1</sub>	4740	284,159	6695	6659	6659	6482
ER <sub>2</sub>	2505	149,470	3730	3470	3456	3393
ER <sub>3</sub>	995	62,266	1501	1459	1527	1465
ER <sub>4</sub>	2458	154,976	3263	3274	3295	3295

### Observed worst case memory accesses

Database	No. of Rules	EGT - PC	HiCuts - 4	HiCuts - 1	HyperCuts - 4	HyperCuts - 1
ER <sub>1</sub>	4740	62	15	18	15	18
ER <sub>2</sub>	2505	63	15	18	15	18
ER <sub>3</sub>	995	49	15	18	15	15
ER <sub>4</sub>	2458	65	15	15	11	15

## Results on Firewall Databases

### Memory space requirement

Database	No. of Rules	EGT - PC	HiCuts - 4	HiCuts - 1	HyperCuts - 4	HyperCuts - 1
FW <sub>1</sub>	279	7,477	48,347	16,978	9,574	6,026
FW <sub>2</sub>	183	3,642	20,995	2,872	4,311	6,675
FW <sub>3</sub>	158	2,962	18,207	6,675	2,164	943
FW <sub>4</sub>	266	4,275	14,624	6,375	9,477	6,991

### Observed worst case memory accesses

Database	No. of Rules	EGT - PC	HiCuts - 4	HiCuts - 1	HyperCuts - 4	HyperCuts - 1
FW <sub>1</sub>	279	63	41	74	26	32
FW <sub>2</sub>	183	55	74	74	20	26
FW <sub>3</sub>	158	56	74	74	17	17
FW <sub>4</sub>	266	38	23	50	17	23

## Results on Synthetic Databases

<i>Database</i>	<i>No. of Rules</i>	<i>Memory Space</i>	<i>Search</i>
<i>ER - 5K</i>	4,970	6,745	14
<i>ER - 10K</i>	9,940	13,482	29
<i>ER - 15K</i>	14,910	20,188	32
<i>ER - 20K</i>	19,880	27,098	35
<i>CR - 5K</i>	5,000	4,508	8
<i>CR - 10K</i>	10,000	8,495	8
<i>CR - 15K</i>	15,000	12,822	11
<i>CR - 20K</i>	20,000	16,857	11
<i>FW - 5K</i>	5,000	14,733	14
<i>FW - 10K</i>	10,000	45,158	14
<i>FW - 15K</i>	15,000	80,486	17
<i>FW - 20K</i>	20,000	150,551	17