



ENTREPÔTS, REPRÉSENTATION
& INGÉNIERIE des CONNAISSANCES



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fVSS: A New Secure and Cost-Efficient Scheme for Cloud Data Warehouses



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DE L'HOMME
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Outline



Introduction & Problems

- Security
- Performance
- Cost



Conclusion

- Conclusion
- Future research



Related works

Sharing databases and data warehouses



Comparative study

- Security
- Performance
- Cost



fVSS

Flexible verifiable secret sharing



Cloud Business Intelligence



Cloud Computing



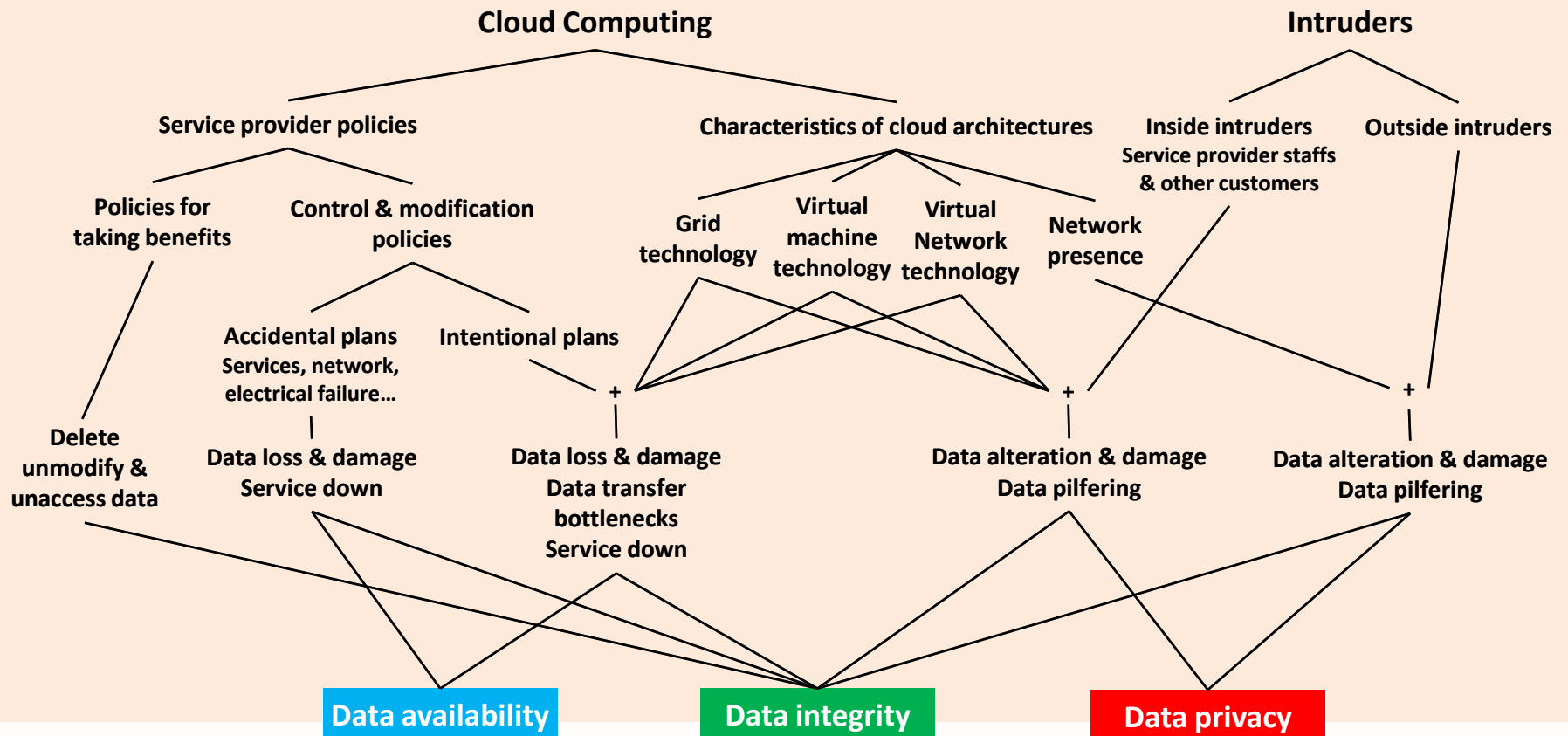
Elasticity of
resources and costs

Business Intelligence

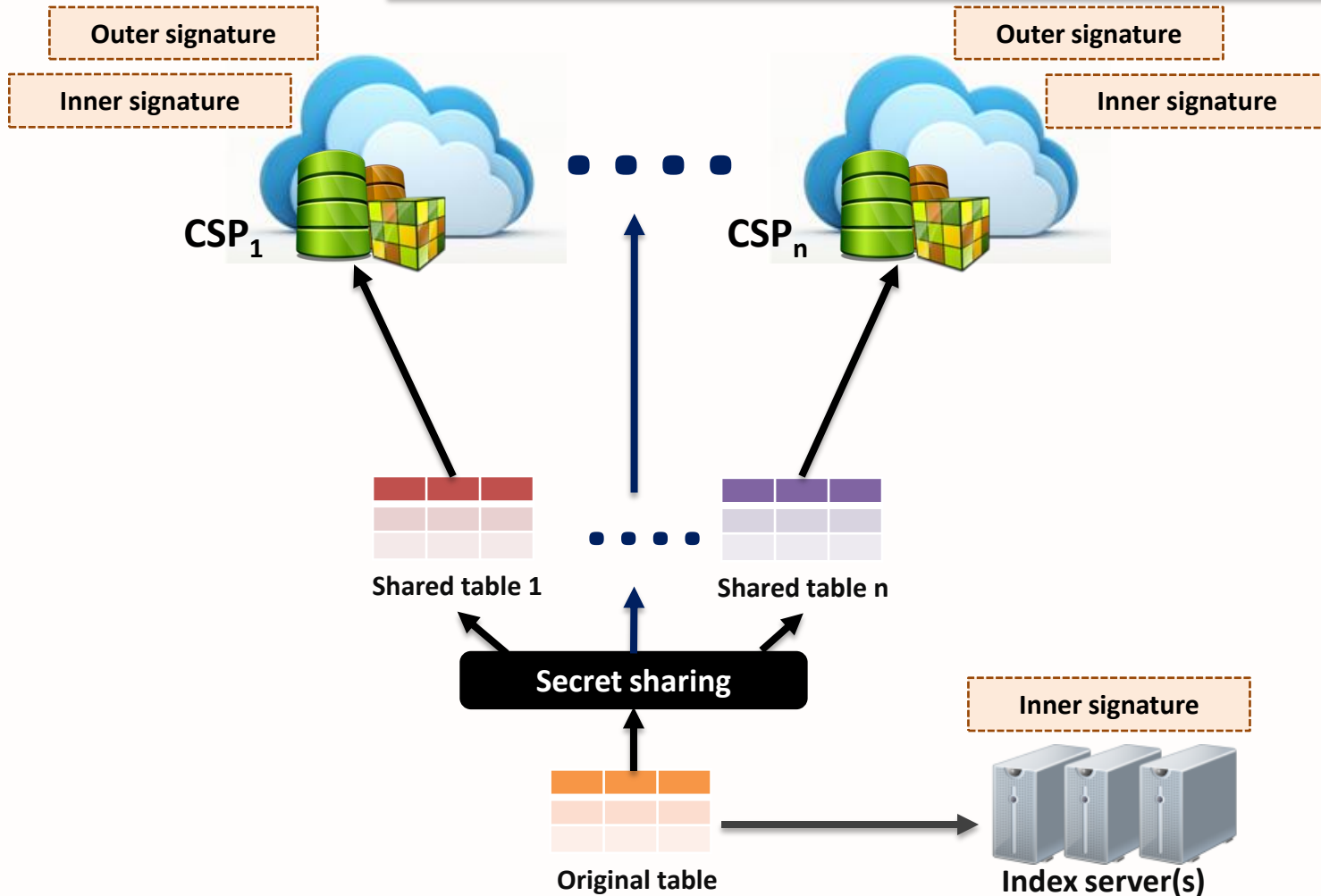
Efficient
decision-support



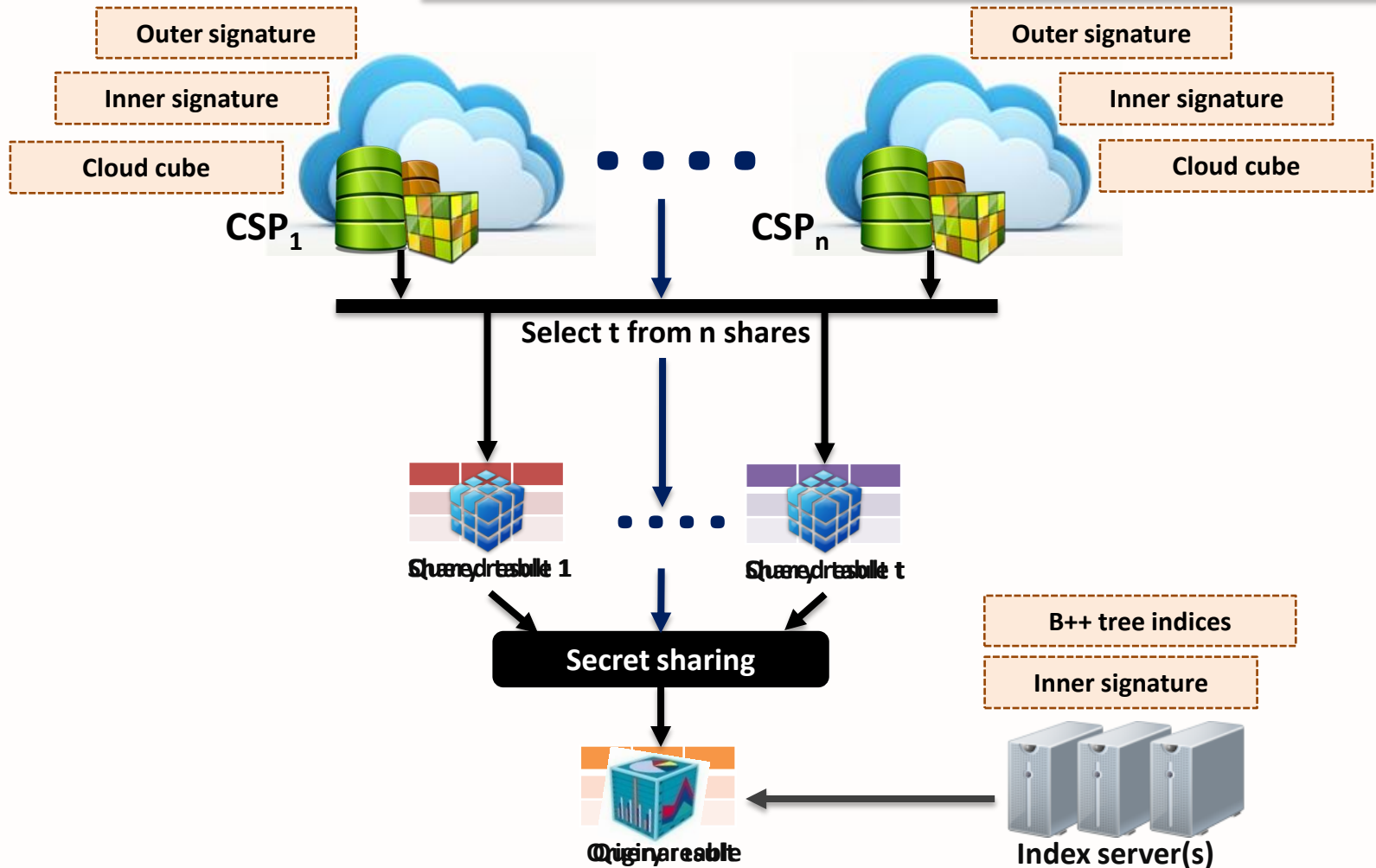
Cloud security issues



Sharing a database



Reconstructing a shared database





fVSS: features

Data Security



Data privacy

- Data transferring
- Data storing
- CSPs cheating



Data integrity

- Share error
- CSP cheating



Data availability

- Data accessing
- Data refreshing

Performance



Data sharing time

Data reconstruction time

Query response time

Costs



Storage cost

Computation cost

Data transfer cost

How to solve?

- **Secret sharing** (new)
- **Inner signatures** (as [2])
- **Outer signatures** (new)
- **Pseudo shares** (new)

How to solve?

- **Run query on shares** (as [1-8])
- **B++ tree indices** (as [6-7][9])
- **Cloud cubes** (extended from [2])
- **Reduce number of shared records** (new)

How to solve?

- **Reduce share volume** (as [2][9])
- **Run query on shares** (as [1-8])
- **Unbalance share volume** (new)
- **Outer signatures** (new)

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

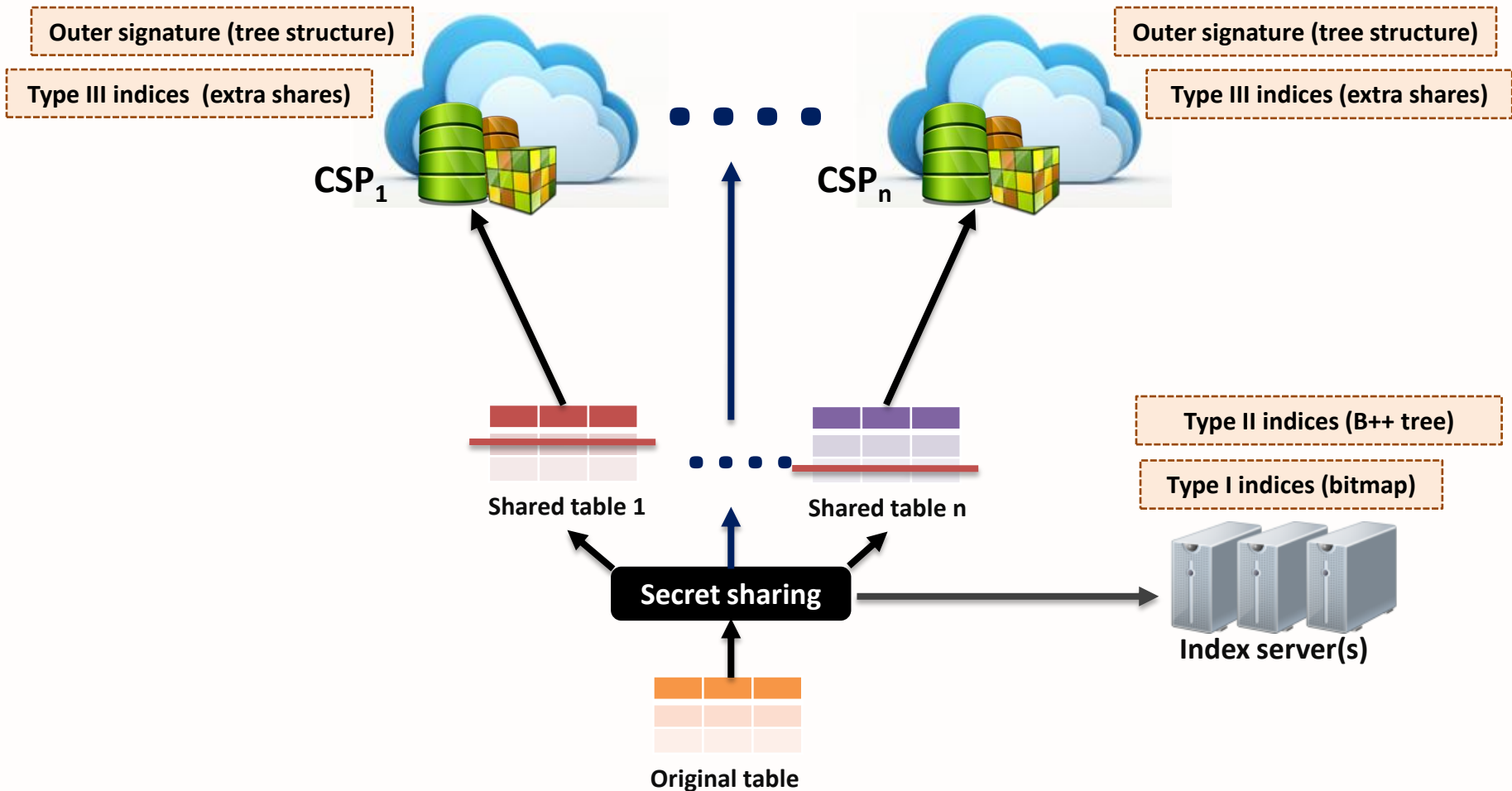
[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

[9] Wang et al. 2011

fVSS: Principle



fVSS: example

Original data

ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	Shirt	Red	1	75
125	Shoe	NULL	2	80
126	Ring	NULL	1	80

Shares at CSP1

ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	{6,5,3,11,7}	{10,5,8}	1	20
126	{10,3,6,12}	NULL	1	30

Shares at CSP2

ProNo	ProName	ProDescr	CategoryID	UnitPrice
125	{6,5,4,5}	NULL	2	38
126	{2,6,11,10}	NULL	1	38

Shares at CSP3

ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	{6,6,5,7,9}	{12,8,1}	1	33
125	{6,5,8,3}	NULL	2	32

Shares at CSP4

ProNo	ProName	ProDescr	CategoryID	UnitPrice
125	{9,15,13,8}	NULL	2	2
126	{2,7,6,9}	NULL	1	14

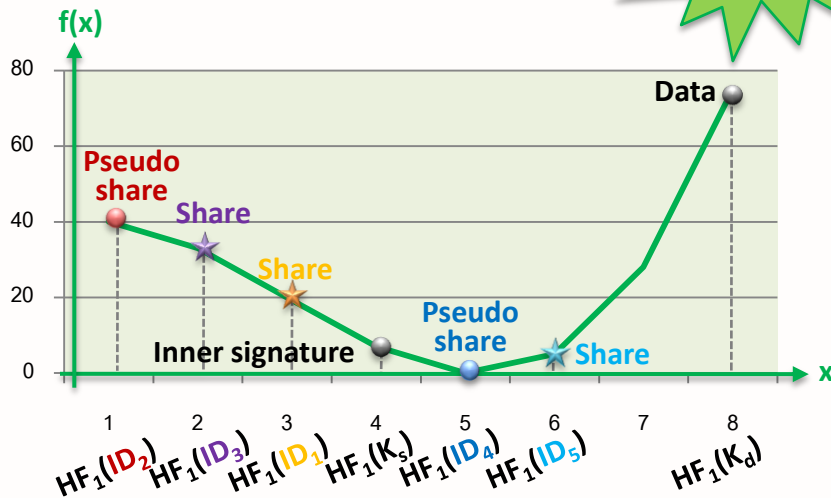
Shares at CSP5

ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	{5,9,11,5}	{10,6,7}	1	5

Type I indices on index server

ProNo	Share location
124	10101
125	01110
126	11010

$n=5, t=4$



fVSS: Data sharing process

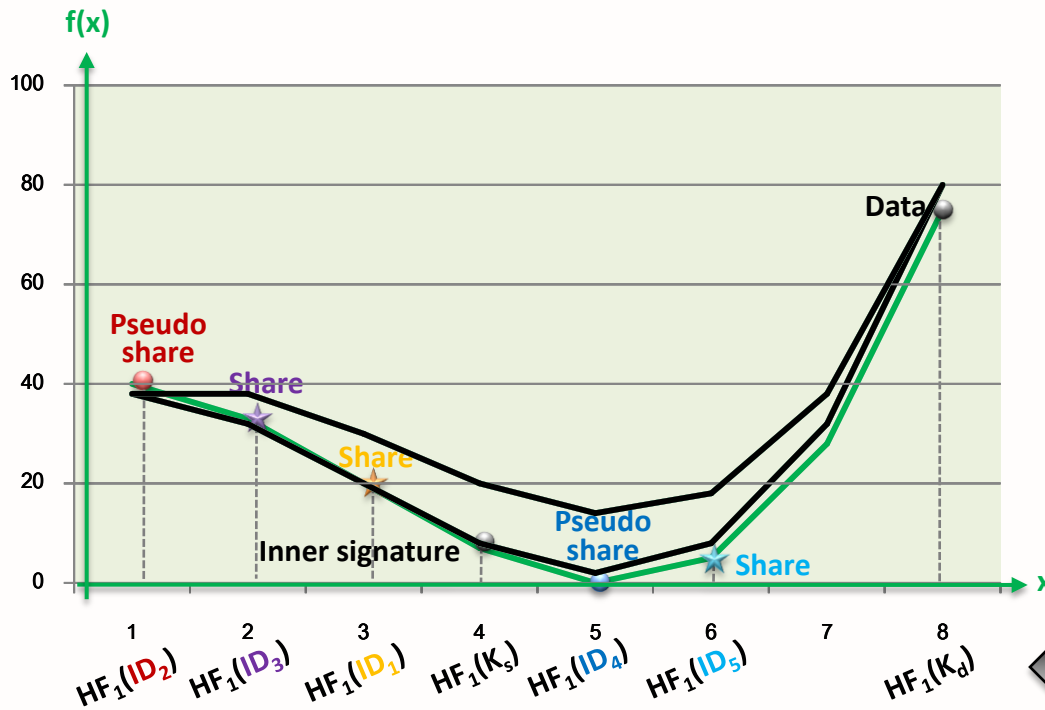
Original data

ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	Shirt	Red	1	75
125	Shoe	NULL	2	80
126	Ring	NULL	1	80

Indices on index server

ProNo	Share location
124	10101
125	01110
126	11010

$n=5$
 $t=4$



Inner signature
(one-variable one-way homomorphic function)

Pseudo share
(two-variable one-way homomorphic function)

polynomial of degree $t-1$
Lagrange interpolation

fVSS: Data reconstruction process

Original data

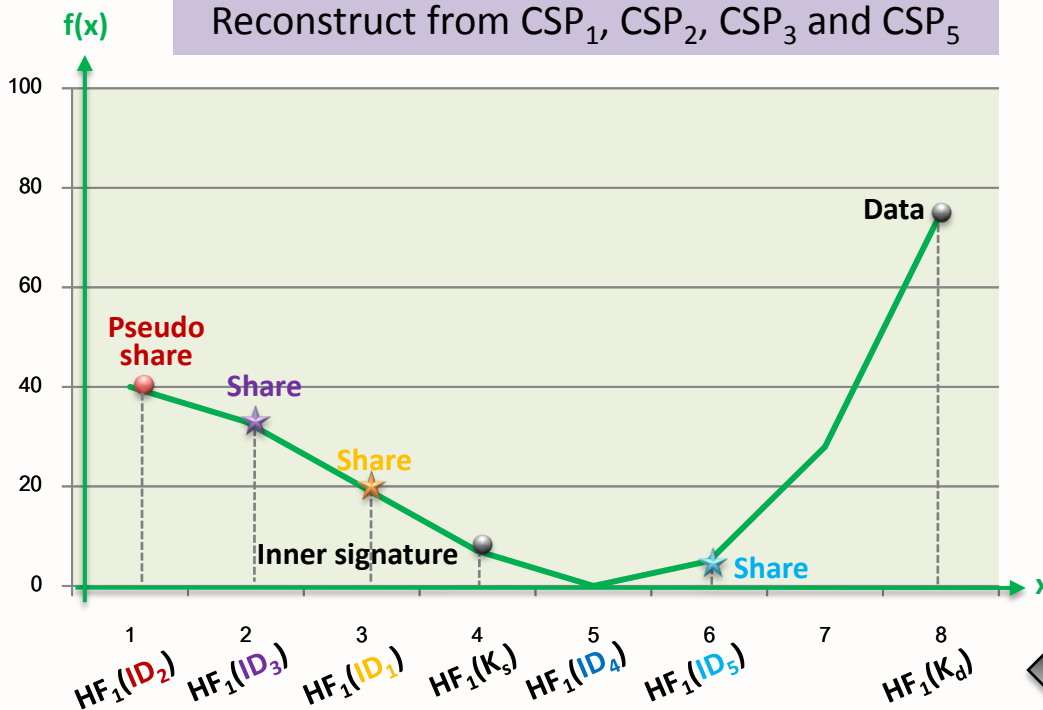
ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	Shirt	Red	1	75
125	Shoe	NULL	2	80
126	Ring	NULL	1	80

Indices on index server

ProNo	Share location
124	10101
125	01110
126	11010

n=5
t=4

Reconstruct from CSP_1, CSP_2, CSP_3 and CSP_5



Inner signature
(one-variable one-way homomorphic function)

Pseudo share
(two-variable one-way homomorphic function)

polynomial of degree t-1
Lagrange interpolation

fVSS: Outer signatures

At CSPI

Table 1

Table 2

Table 3

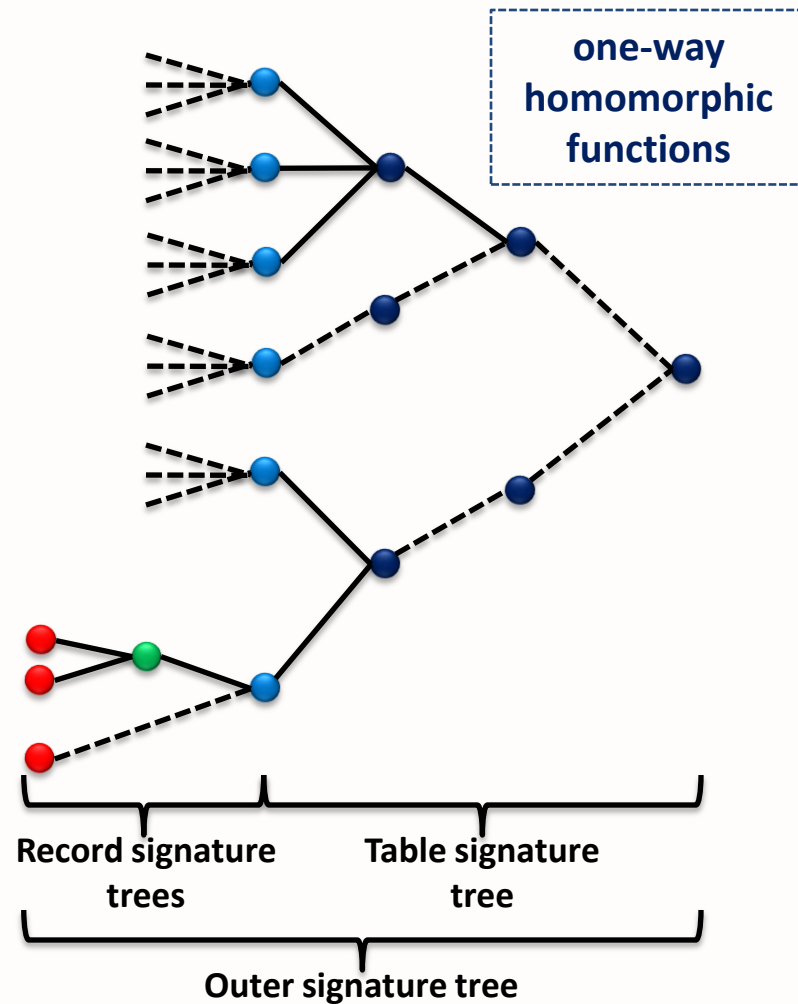
⋮

Table m-1

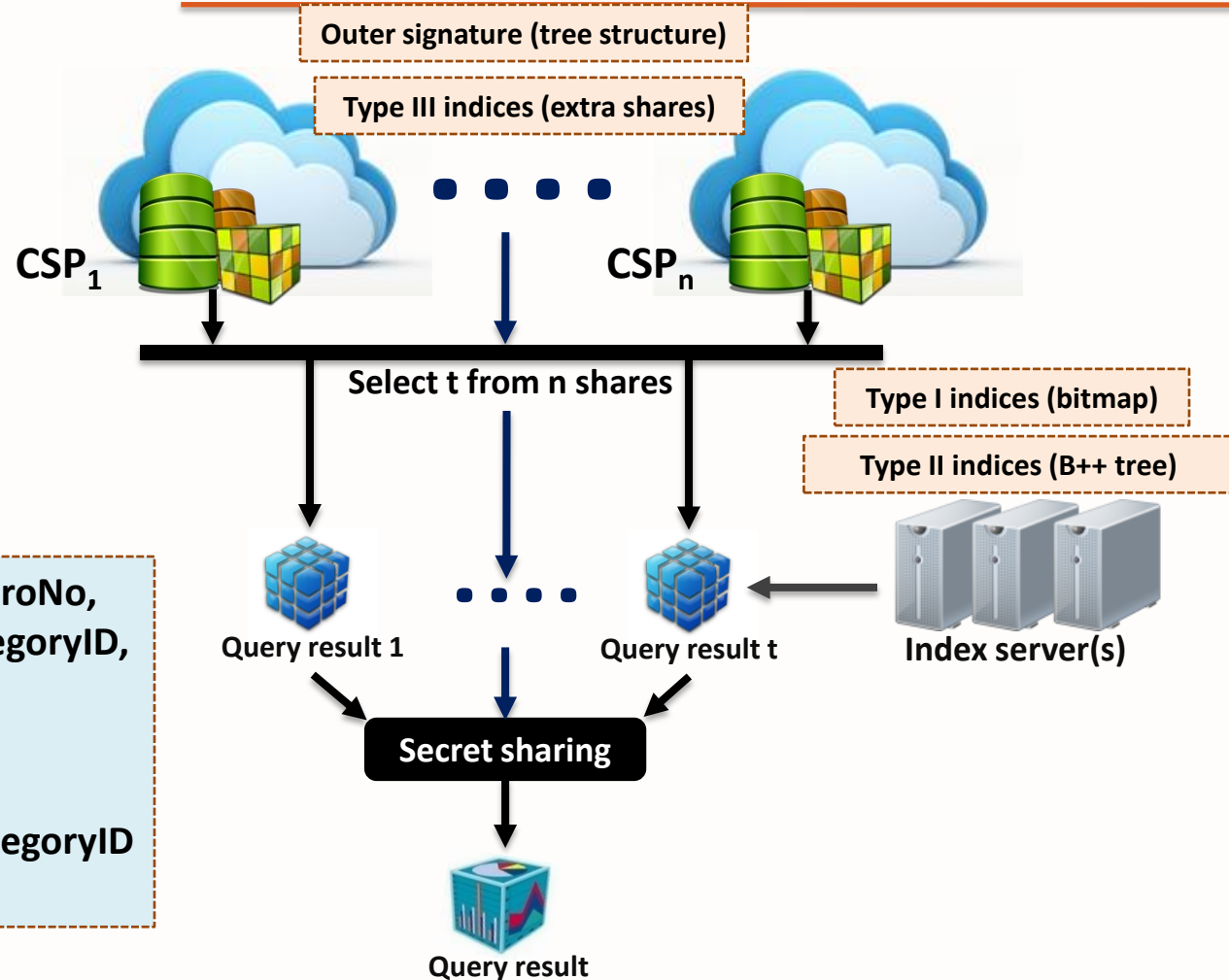
Table m (*Produce*)

ProNo	ProName	ProDescr	CategoryID	UnitPrice
124	{6,5,3,11,7}	{10,5,8}	1	20
126	{10,3,6,12}	NULL	1	30
⋮	⋮	⋮	⋮	⋮
937	{2,5,3,7}	{9,15,21,15}	2	54

- Record's signature
- Records' signature
- Records' signature or table's signature
- Tables' signature



Shared data warehouses



```

SELECT P.ProdName, P.ProNo,
C.CategoryName, C.CategoryID,
SUM(P.UnitPrice+P.tax)
FROM Product AS P
JOIN Category AS C
ON P.CategoryID = C.CategoryID
GROUP BY P.CategoryID

```



Cloud cubes

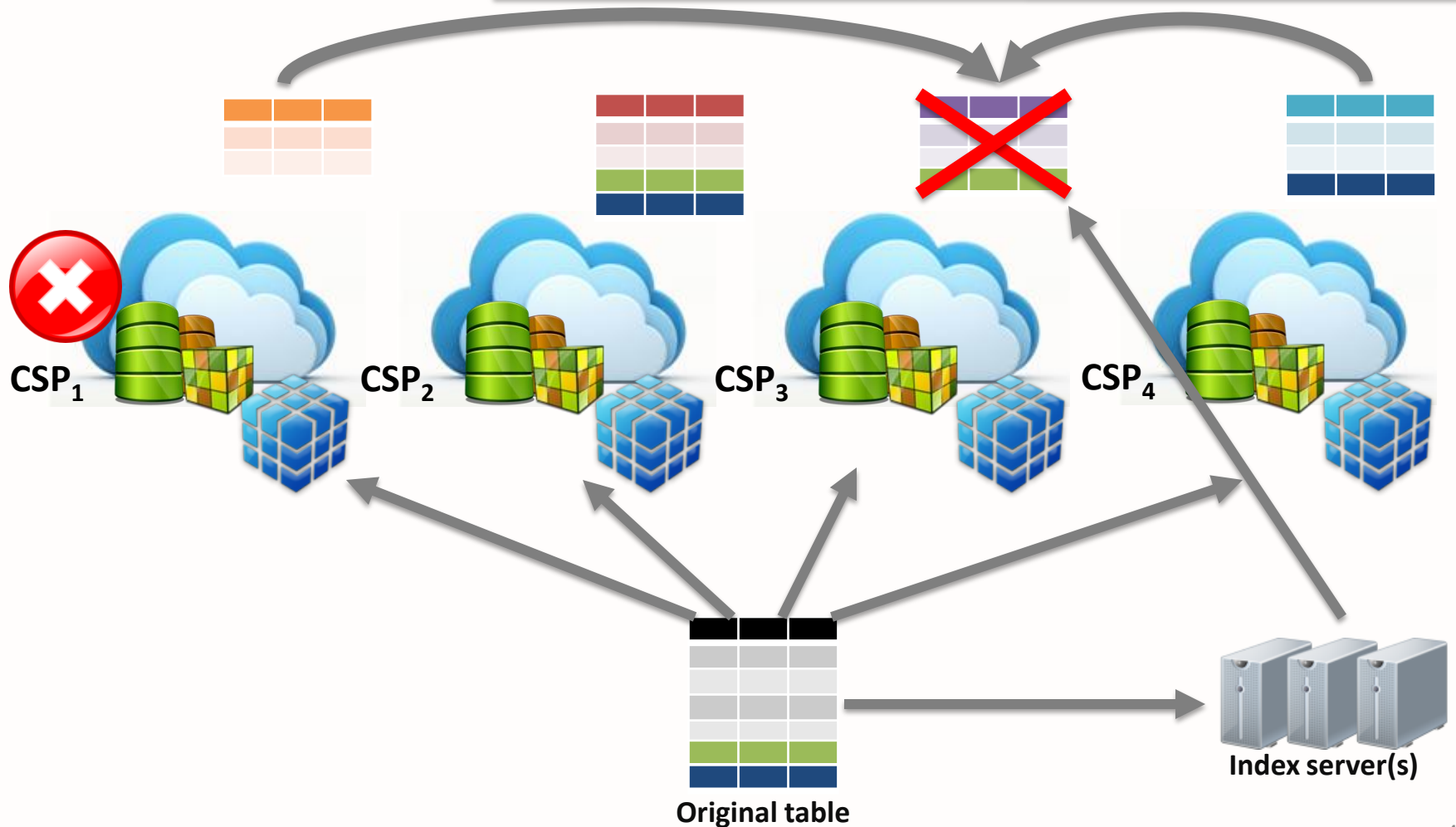
	Time attributes			Produce attributes		Aggregation attributes	
	YearID	MonthID	DateID	CategoryID	ProdNo	TotalPrice	Number
#1	NULL	NULL	NULL	NULL	NULL	83231	58244
#2	NULL	NULL	NULL	1	NULL	26701	18254
#3	NULL	NULL	NULL	1	1	8958	7113
	NULL	NULL	NULL	1
	NULL	NULL	NULL	1	2	4348	1844
	NULL	NULL	NULL
#4	1	NULL	NULL	NULL	NULL	44574	54542
#5	1	1	NULL	NULL	NULL	21158	8954
#6	1	1	1	NULL	NULL	9754	4544

Time hierarchical summarization part

+ All products

the whole time (#1) ↔ each year (#4 etc.) ↔ each month (#5 etc.) ↔ each date (#6 etc.)

Load, Backup and Recovery Processes





Security analysis

Comparison of database sharing approaches

Features	[2]	[1][3-7]	[8-9]	fvss
Data privacy				
- Data transferring	Yes	Yes	Yes	Yes
- Data storing	Yes	Yes	Yes	Yes
- CSPs cheating	-	-	-	Yes if $n < 2t-2$
Data availability	Yes	Yes	Yes	Yes
Ability in case CSPs fail, to				
- Query shares	Yes if $\leq n-t$ CSPs fail	Yes if $\leq n-t$ CSPs fail	Yes if $\leq n-t$ CSPs fail	Yes if $\leq n-t$ CSPs fail
-Update shares	-	-	-	Yes if $\leq t-2$ CSPs fail
Data integrity				
- Inner code verifying	Verify data or query result	-	Verify data	Verify data or query result
- Outer code verifying	Verify individual share	-	-	Verify Table(s) or records(s)

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

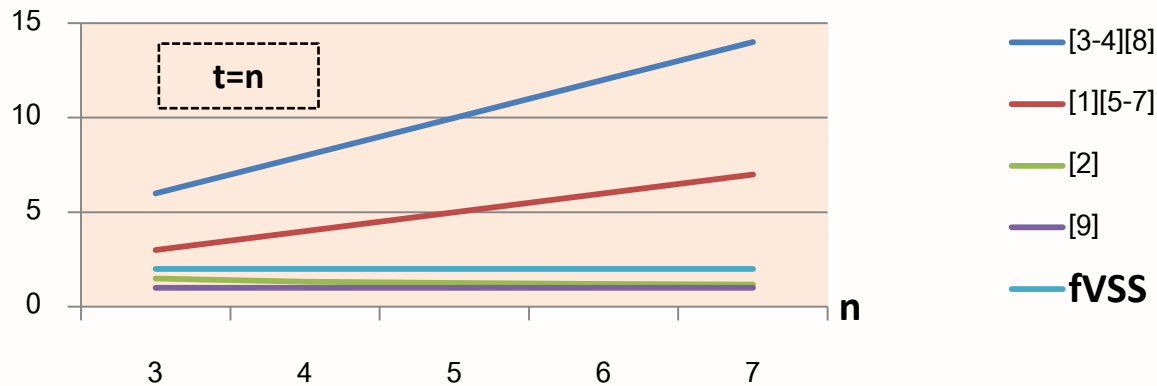
[8] Thompson et al. 2009

[9] Wang et al. 2011

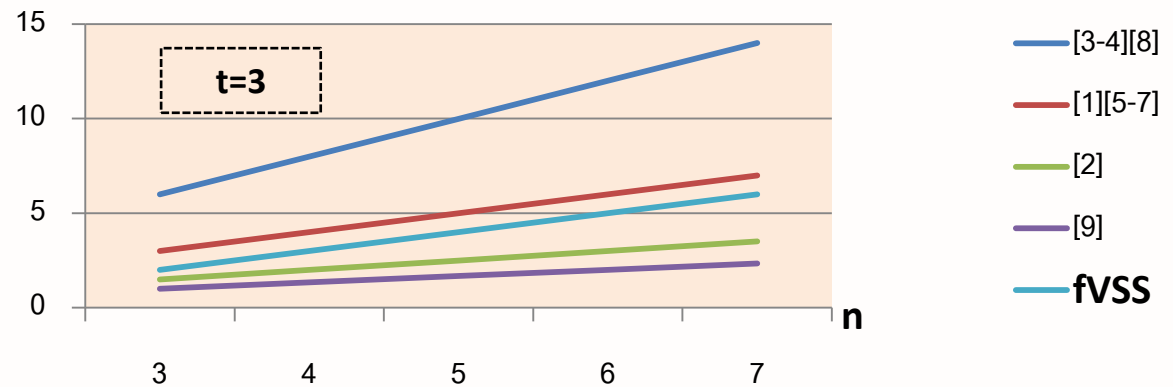
Storage volume



Share volume (Times of original volume)



Share volume (Times of original volume)



- [1] Agrawal et al. 2009 [2] Attasena et al. 2014 [3] Emekci et al. 2005 [4] Emekci et al. 2006
 [5] Hadavi et al. 2012.a [6] Hadavi et al. 2010 [7] Hadavi et al. 2012.b [8] Thompson et al. 2009 [9] Wang et al. 2011

Performance analysis



Comparison of database sharing approaches

Features	[1]	[2]	[3]	[4-5]	[6-7]	[8]	[9]	fvss
Target	DBs	DWs	DWs	DBs	DBs	DBs	DBs	DWs
Data sources	Single	Single	Multi	Multi	Single	Single	Single	Single
Data Types	Positive integers	Integers, Reals, Characters, Strings, Dates, Booleans	Positive integers	Integers	Positive integers	Positive integers	Positive integers	Integers, Reals, Characters, Strings, Dates, Booleans
Shared data access								
- Updates	-	Yes	-	Yes	Yes	Yes	Yes	Yes
- Exact match queries	-	Yes	Yes	Yes	Yes	-	Yes	Yes
- Range queries	-	-	Yes	Yes	Yes	-	Yes	Yes
-Aggregation queries on one attribute	Yes	Yes	Yes	Yes	Yes	Yes	-	Yes
-Aggregation queries on two attributes	-	-	-	-	-	-	-	Yes
- Grouping queries	-	Yes	-	-	-	-	-	Yes

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

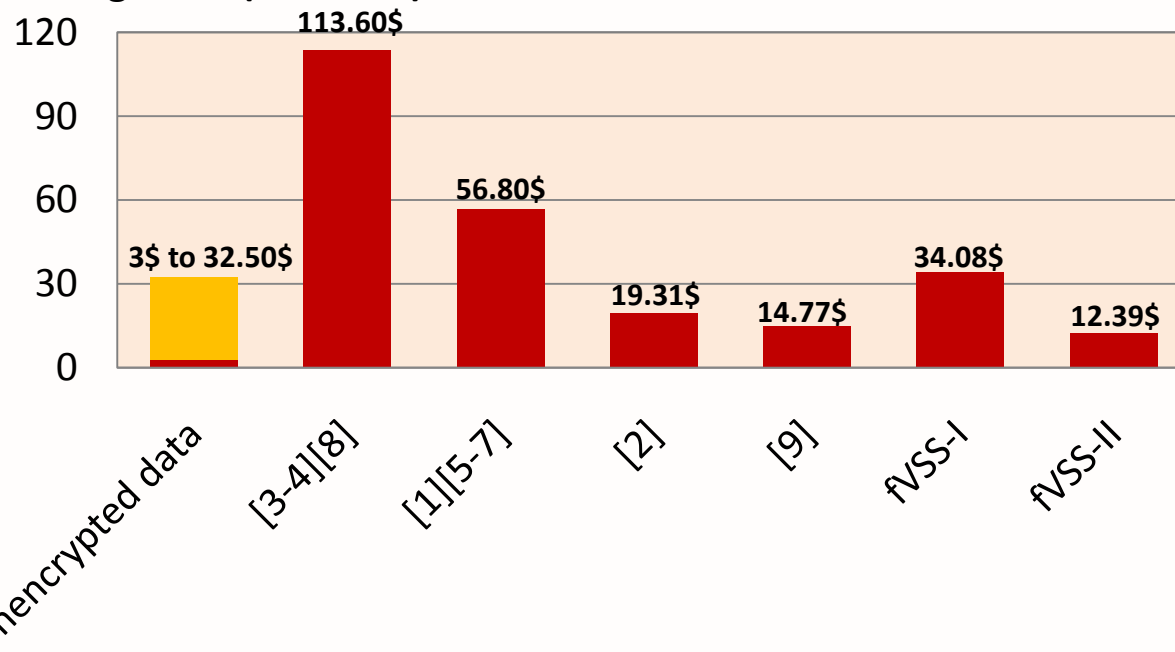
[8] Thompson et al. 2009

[9] Wang et al. 2011

**n=5, t=4,
V=100GB**

Storage cost

Storage cost (\$/month)



[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

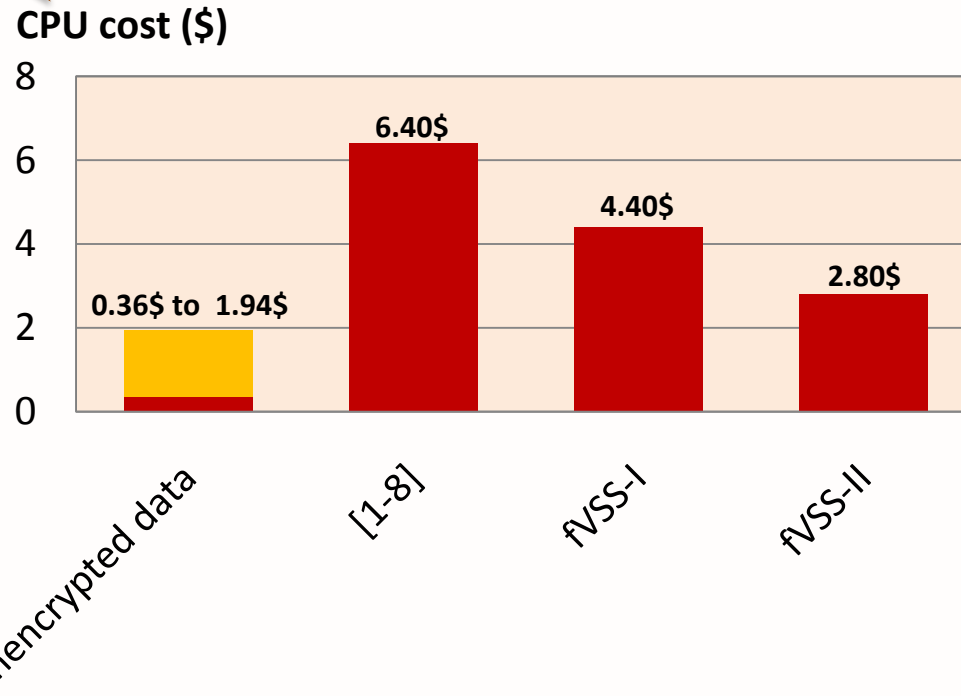
[9] Wang et al. 2011



Sharing cost



**n=5, t=4,
10¹⁵ records
are shared**



[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

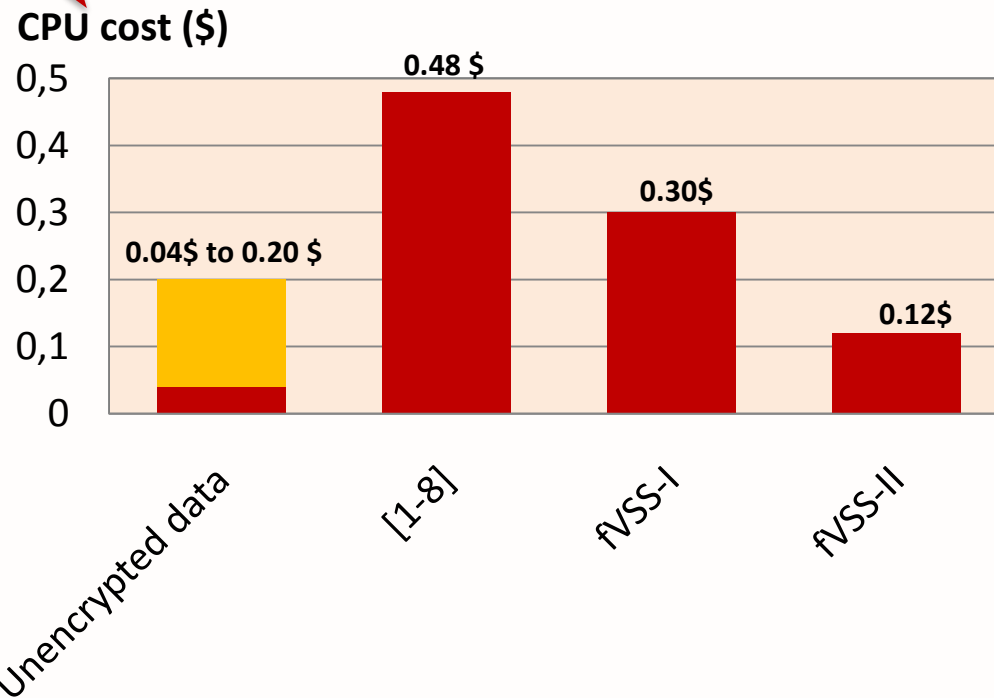
[8] Thompson et al. 2009

[9] Wang et al. 2011

**n=5, t=4,
10% of records
match a query
(10^{14} records)**



Data access cost



[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

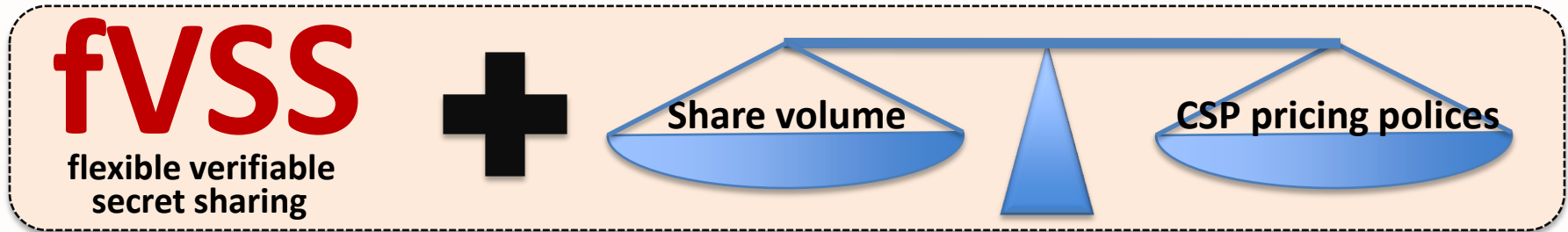
[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

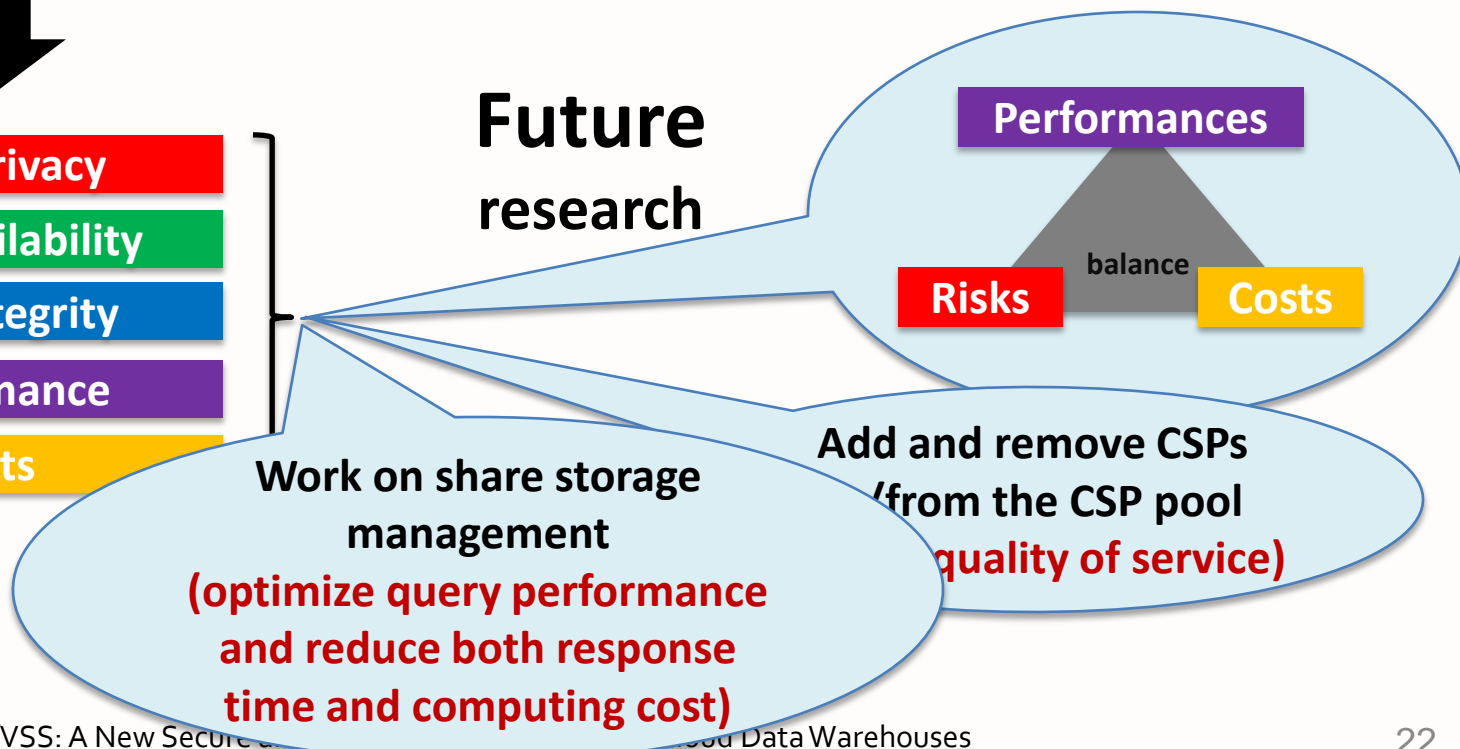
[9] Wang et al. 2011

Conclusion



- Data privacy
- Data availability
- Data integrity
- Performance
- Costs

Future research





Thank you

Features of related works

Data Security



Data privacy

- Data transferring [1-9]
- Data storing [1-9]
- CSPs cheating



Data integrity

- Share error [2]
- CSP cheating [2][8-9]



Data availability

- Data accessing [1-9]
- Data refreshing

Performance



Data sharing time

Data reconstruction time

Query response time [1-9]

Costs



Storage cost [2][9]

Computation cost [1-9]

Data transfer cost [1-9]

How to solve?

- Secret sharing [1-9]
- Inner signatures [2]
- Outer signatures [2][8-9]

How to solve?

- Run query on shares [1-9]
- B++ tree indices [6-7][9]
- Cloud cubes [2]

How to solve?

- Reduce share volume [2][9]
- Run query on shares [1-9]

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

[9] Wang et al. 2011

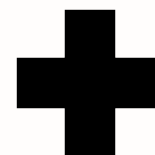
Performance analysis



Execution
time



Time
at user's



(MAX) Time
at CSPs'

Comparison of database sharing approaches

Approaches	Time complexity at user's		Number of shared records
	Sharing time	Reconstruction time	
[1-8]	$O(xnt)$	$O(yt^2)$	rn
[9]	$O(\text{MAX}(x \log x, xn))$	$O(yt)$	NA
fvss	$O(xt(n-t))$	$O(yt^2)$	$r(n-t+2)$

(x is number of shared data pieces. y is number of reconstructed data pieces. r is number of original records.)

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

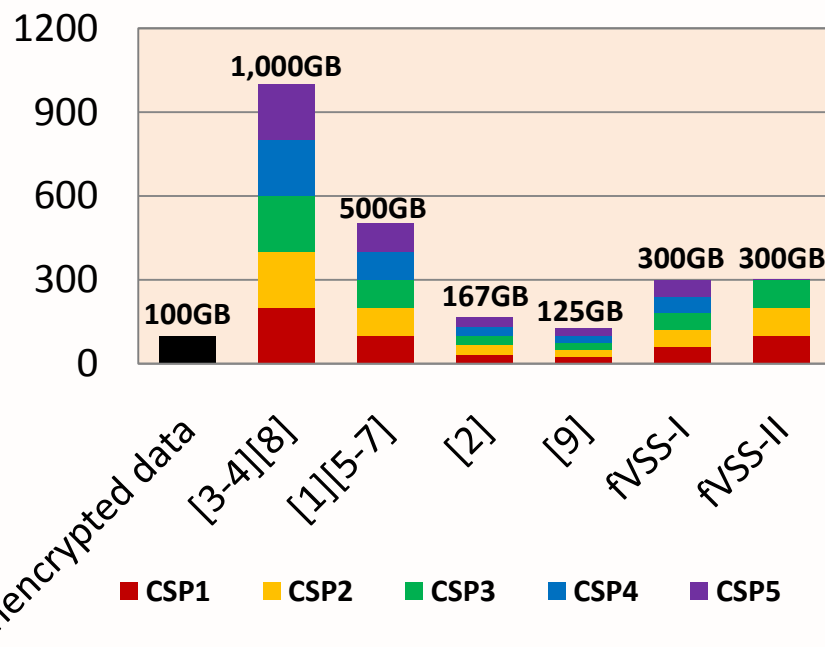
[9] Wang et al. 2011

**n=5, t=4,
V=100GB**

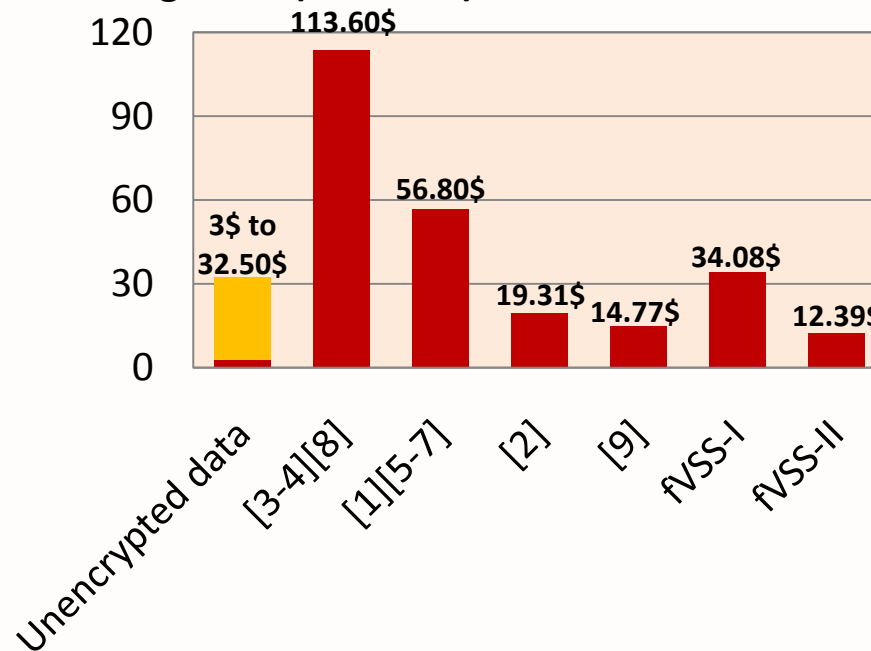
Storage cost

CSP pricing policies	CSP ₁	CSP ₂	CSP ₃	CSP ₄	CSP ₅
Storage cost (\$/GB/month)	0.030	0.040	0.053	0.120	0.325

Share volume (GB)



Storage cost (\$/month)



[1] Agrawal et al. 2009
[5] Hadavi et al. 2012.a

[2] Attasena et al. 2014
[6] Hadavi et al. 2010

[3] Emekci et al. 2005
[7] Hadavi et al. 2012.b

[4] Emekci et al. 2006

[8] Thompson et al. 2009

[9] Wang et al. 2011



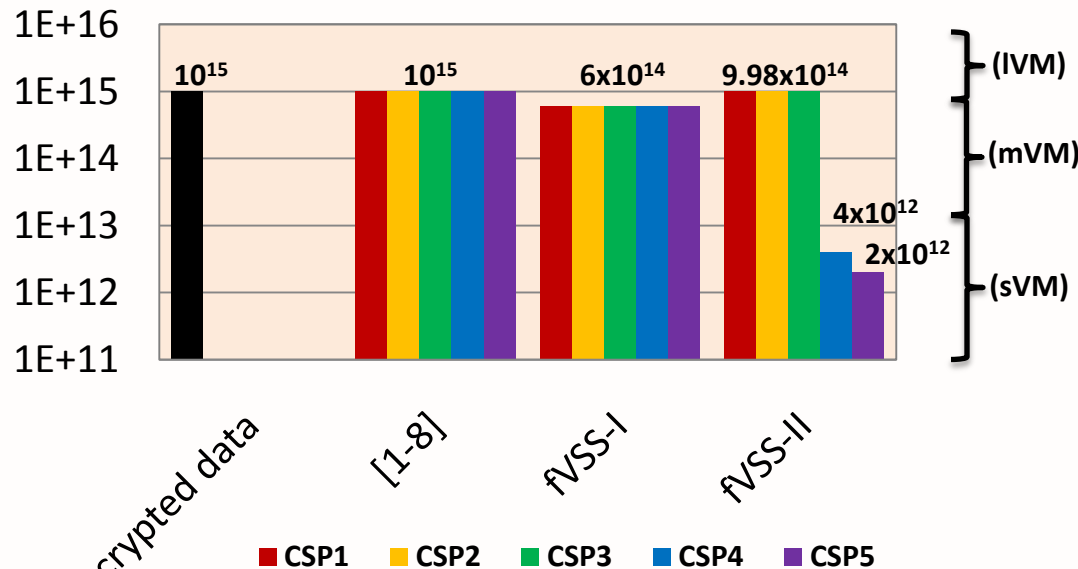
Sharing cost



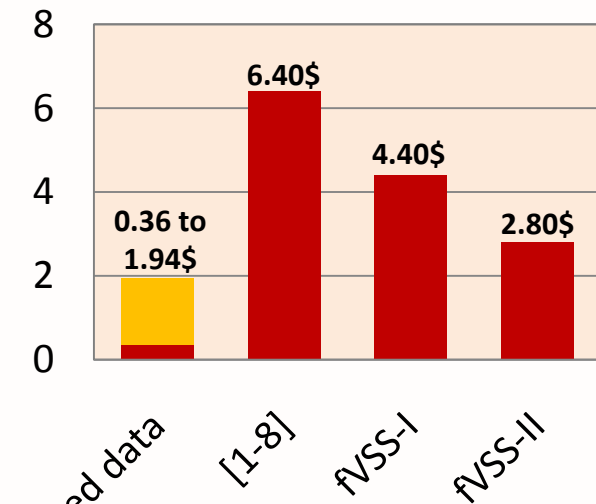
$n=5, t=4,$
 10^{15} records
are shared

Machines	Computing powers (records/seconds)	CSP pricing policies (\$/hour)				
		CSP ₁	CSP ₂	CSP ₃	CSP ₄	CSP ₅
sVM	1×10^{10}	0.013	0.059	0.058	0.060	0.070
mVM	2×10^{10}	0.026	0.079	0.115	0.120	0.140
IVM	4×10^{10}	0.053	0.120	0.230	0.240	0.280

records at each CSP



CPU cost (\$)



[1] Agrawal et al. 2009
[5] Hadavi et al. 2012.a

[2] Attasena et al. 2014
[6] Hadavi et al. 2010

[3] Emekci et al. 2005
[7] Hadavi et al. 2012.b

[4] Emekci et al. 2006

[8] Thompson et al. 2009 [9] Wang et al. 2011

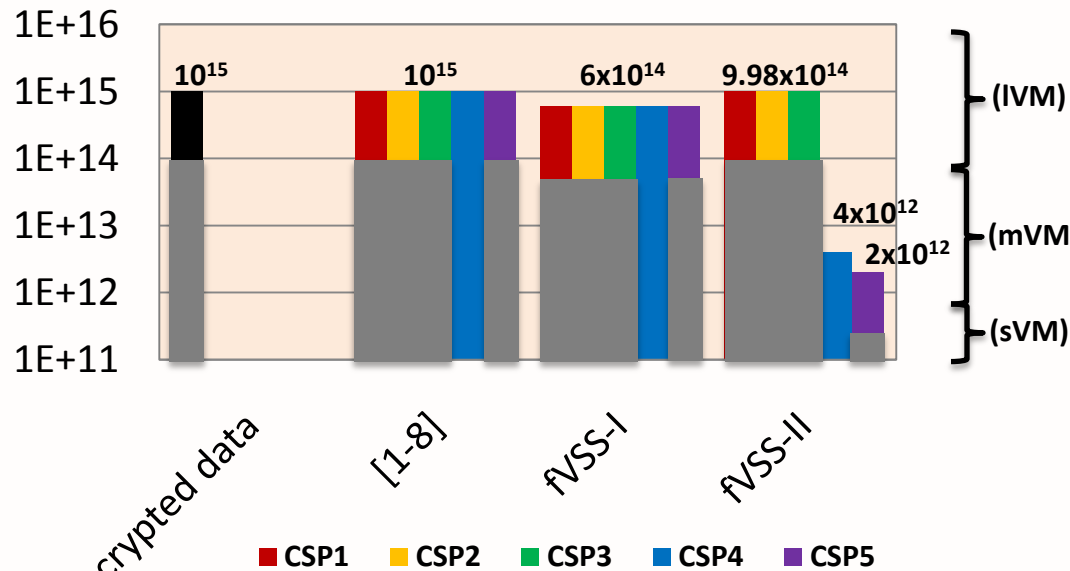
**n=5, t=4,
10% of records
match a query
(10¹⁴ records)**

Data access cost

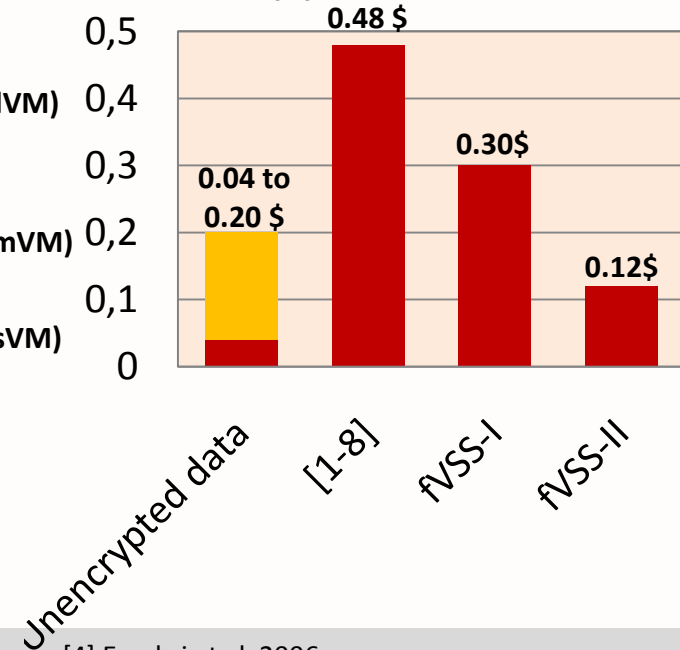


Machines	Computing powers (records/seconds)	CSP pricing policies (\$/hour)				
		CSP ₁	CSP ₂	CSP ₃	CSP ₄	CSP ₅
sVM	1×10 ¹⁰	0.013	0.059	0.058	0.060	0.070
mVM	2×10 ¹⁰	0.026	0.079	0.115	0.120	0.140
IVM	4×10 ¹⁰	0.053	0.120	0.230	0.240	0.280

records at each CSP



CPU cost (\$)



[1] Agrawal et al. 2009 [2] Attasena et al. 2014 [3] Emekci et al. 2005 [4] Emekci et al. 2006
 [5] Hadavi et al. 2012.a [6] Hadavi et al. 2010 [7] Hadavi et al. 2012.b [8] Thompson et al. 2009 [9] Wang et al. 2011

$n=5, t=4,$
 $V=100\text{GB}$



Storage cost



CSP pricing policies

	CSP ₁	CSP ₂	CSP ₃	CSP ₄	CSP ₅
Storage cost (\$/GB/month)	0.030	0.040	0.053	0.120	0.325

Approach	Share volume (GB)			Storage cost (\$/month)
	Global		Per CSP	
Unencrypted data	V	100	100	3 to 32.5
[3-4][8]	2nV	1,000	200	113.60
[1][5-7]	nV	500	100	56.80
[2]	$nV/(t-1)$	167	34	19.31
[9]	nV/t	125	25	14.77
fVSS-I	$(n-t+2)V$	300	60	34.08
fVSS-II	$(n-t+2)V$	300	99.8+99.8+99.8+0.4+0.2	12.39

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

[9] Wang et al. 2011

n=5, t=4,
10¹⁵ records
are shared

Computation cost



Machines	Computing powers (seconds/seconds)	CSP pricing policies (\$/hour)				
		CSP ₁	CSP ₂	CSP ₃	CSP ₄	CSP ₅
sVM	1×10 ¹⁰	0.013	0.059	0.058	0.060	0.070
mVM	2×10 ¹⁰	0.026	0.079	0.115	0.120	0.140
IVM	4×10 ¹⁰	0.053	0.120	0.230	0.240	0.280

Sharing cost comparison

Approach	# records at each CSP	VM type	Sharing time (h:mm)	CPU cost (\$)
Unencrypted data	10 ¹⁵	IVM	6:57	0.36 to 1.94
[1-8]	10 ¹⁵	IVM	6:57	6.40
fVSS-I	6 x 10 ¹⁴	mVM	8:20	4.40
fVSS-II	9.98 x 10 ¹⁴	IVM	6:56	2.80
	9.98 x 10 ¹⁴	IVM	6:56	
	9.98 x 10 ¹⁴	IVM	6:56	
	4 x 10 ¹²	sVM	0:07	
	2 x 10 ¹²	sVM	0:04	

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

[8] Thompson et al. 2009

[9] Wang et al. 2011

$n=5, t=4,$
10% of records
match a query
(10^{14} records)



Computation cost



Machines	Computing powers (seconds/seconds)	CSP pricing policies (\$/hour)				
		CSP ₁	CSP ₂	CSP ₃	CSP ₄	CSP ₅
sVM	1×10^{10}	0.013	0.059	0.058	0.060	0.070
mVM	2×10^{10}	0.026	0.079	0.115	0.120	0.140
IVM	4×10^{10}	0.053	0.120	0.230	0.240	0.280

Data access cost comparison

Approach	# records at each CSP	VM type	response time (h:mm)	CPU cost (\$)
Unencrypted data	10^{14}	IVM	0:42	0.04 to 0.20
[1-8]	10^{14}	IVM	0:42	0.48
fVSS-I	6×10^{13}	mVM	0:50	0.30
fVSS-II	9.98×10^{13}	IVM	0:42	0.12
	9.98×10^{13}	IVM	0:42	
	0	-	0:42<=0:00	
	4×10^{11}	sVM	0:01	
	2×10^{11}	sVM	0:01	

[1] Agrawal et al. 2009

[2] Attasena et al. 2014

[3] Emekci et al. 2005

[4] Emekci et al. 2006

[5] Hadavi et al. 2012.a

[6] Hadavi et al. 2010

[7] Hadavi et al. 2012.b

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