



# Oracle R Enterprise

Proširenja su u paketima

Krešimir Bokulić  
Branko Radovanović

 multicom

# Multicom

- **Glavna područja ekspertize:**

- Data Mining
- Obračun i naplata (**Billing**)
- Upravljanje matičnim podacima (**MDM**)
- Skladišta podataka (**DWH**) i Poslovna Inteligencija (**BI**)
- **B2B**
- Upravljanje korisničkim procesima (**CRM**)



# Reference

## Telco

...



T-Mobile

Optima



vip Vipnet



Metronet®

МАКЕДОНСКИ  
ТЕЛЕКОМУНИКАЦИИ



## Finance

...



FinA

MBU

ERSTE

otp banka

Zagrebačka banka  
UniCredit Group

## Public/Utility ....



Ministry of Foreign Affairs  
and European Integration



City of zagreb



HEP  
OPERATOR PRIJENOSNOG SUSTAVΑ d.o.o.

SIEMENS

HOPS

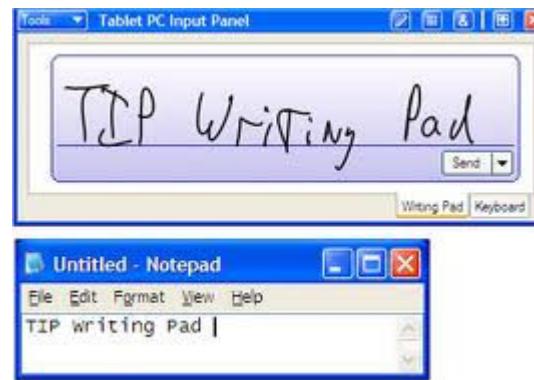
KONČAR  
Končar - Inženjerija za  
energetiku i transport d.d.

multicom

# Advanced Analytics - svuda oko nas



Spam filters



Prepoznavanje rukopisa

Ads i

**Google AdWords**

[www.google.hr/AdWords](http://www.google.hr/AdWords) ▾

Vaš oglaš na svjetskoj tražilici.

Ovlašavajte na Google!

**Online Ovlašavanje**

[www.interartmedia.net/GoogleAdwords](http://www.interartmedia.net/GoogleAdwords) ▾

Unaprijedite svoje poslovanje!

Adwords™ certificirani partner

**Expedia Hotels**

[www.expedia.ie/Hotels](http://www.expedia.ie/Hotels) ▾

Book Online & Save up to 50%.

Great deals on Hotels

**Hotels.com: Cheap Hotels**

[www.hotels.com/Cheap-Hotels](http://www.hotels.com/Cheap-Hotels) ▾

Exclusive Deals, Central Locations!

Search & Book Cheap Hotels online.

Google ads



## Loyalty cards



## Credit risk

### Frequently Bought Together



price for all three: \$77.97

[Add all three to Cart](#)

[Add all three to Wish List](#)

[Show availability and shipping details](#)

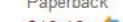
- This item:** Python Pocket Reference (Pocket Reference (O'Reilly)) by Mark Lutz Paperback \$8.99
- Learning Python, 5th Edition by Mark Lutz Paperback \$38.99
- Python Cookbook by David Beazley Paperback \$29.99

### Customers Who Bought This Item Also Bought

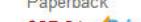


[C++ Pocket Reference](#)  
by Kyle Loudon  
 (21)  
Paperback  
\$9.45 

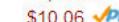


[JavaScript Pocket Reference \(Pocket ...](#)  
by David Flanagan  
 (14)  
Paperback  
\$10.16 



[Python Essential Reference \(4th ...](#)  
by David M. Beazley  
 (71)  
Paperback  
\$27.21 



[Perl Pocket Reference](#)  
by Johan Vromans  
 (18)  
Paperback  
\$10.06 

## Amazon recommendation engine

# Što je R?

- R je Open Source jezik i okolina za statističke proračune i grafiku
- Stvoren 1994 kao alternativa SAS-u i SPSS-u
- Preko 2 milijuna R korisnika u svijetu
- Tisuće open source paketa na CRAN mreži
- CRAN – Comprehensive R Archive Network



CRAN  
[Mirrors](#)  
[What's new?](#)  
[Task Views](#)  
[Search](#)

About R  
[R Homepage](#)  
[The R Journal](#)

Software  
[R Sources](#)  
[R Binaries](#)  
[Packages](#)  
[Other](#)

Documentation  
[Manuals](#)  
[FAQs](#)  
[Contributed](#)

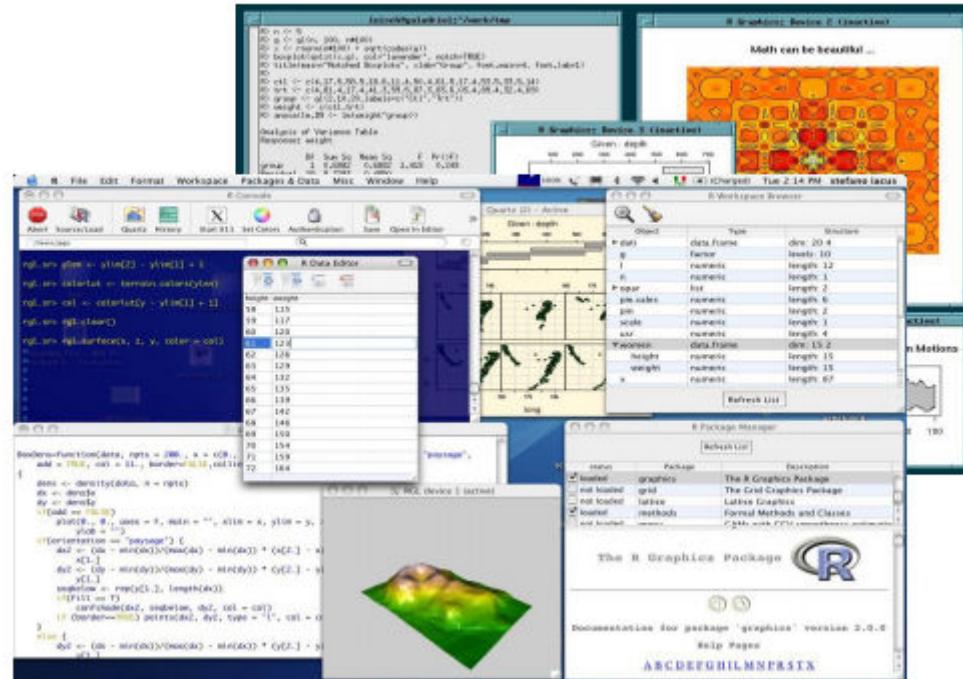
## CRAN Task Views

<a href="#">Bayesian</a>	Bayesian Inference
<a href="#">ChemPhys</a>	Chemometrics and Computational Physics
<a href="#">ClinicalTrials</a>	Clinical Trial Design, Monitoring, and Analysis
<a href="#">Cluster</a>	Cluster Analysis & Finite Mixture Models
<a href="#">DifferentialEquations</a>	Differential Equations
<a href="#">Distributions</a>	Probability Distributions
<a href="#">Econometrics</a>	Computational Econometrics
<a href="#">Environmetrics</a>	Analysis of Ecological and Environmental Data
<a href="#">ExperimentalDesign</a>	Design of Experiments (DoE) & Analysis of Experimental Data
<a href="#">Finance</a>	Empirical Finance
<a href="#">Genetics</a>	Statistical Genetics
<a href="#">Graphics</a>	Graphic Displays & Dynamic Graphics & Graphic Devices & Visualization
<a href="#">HighPerformanceComputing</a>	High-Performance and Parallel Computing with R
<a href="#">MachineLearning</a>	Machine Learning & Statistical Learning
<a href="#">MedicalImaging</a>	Medical Image Analysis
<a href="#">MetaAnalysis</a>	Meta-Analysis
<a href="#">Multivariate</a>	Multivariate Statistics
<a href="#">NaturalLanguageProcessing</a>	Natural Language Processing
<a href="#">NumericalMathematics</a>	Numerical Mathematics
<a href="#">OfficialStatistics</a>	Official Statistics & Survey Methodology
<a href="#">Optimization</a>	Optimization and Mathematical Programming
<a href="#">Pharmacokinetics</a>	Analysis of Pharmacokinetic Data
<a href="#">Phylogenetics</a>	Phylogenetics, Especially Comparative Methods
<a href="#">Psychometrics</a>	Psychometric Models and Methods

# Zašto koristiti R?

R okolina je:

- Proširiva
- Omogućuje kvalitetnu grafiku
- Jednostavna za instalaciju
- Produktivna
- Fleksibilna
- Besplatna
- Otvorena



R je statistički jezik sličan Base SAS –u i SPSS-u

# Oracle Advanced Analytics

## Oracle Advanced Analytics:

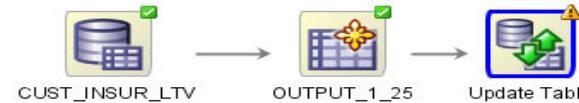
- Oracle R Enterprise
  - Integrira open source programski jezik R unutar Oracle baze podataka
- Oracle Data Mining
  - SQL & PL/SQL fokusiran na in-database data mining –u



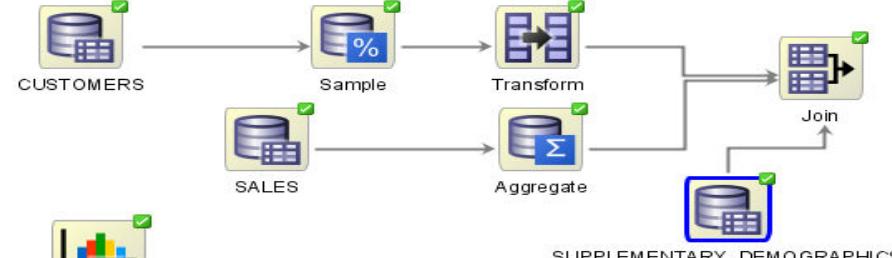
- Opcija Oracle 11gR2 enterprise baze
- Omogućuje naprednu analitiku unutar baze podataka

# Oracle Data Miner

## Tables and Views



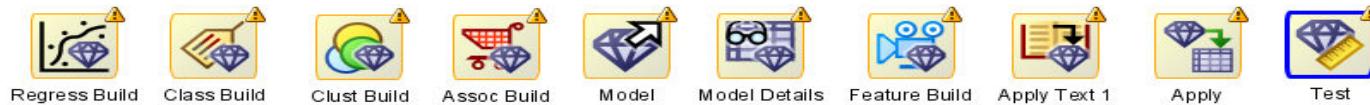
## Transformations



## Explore Data

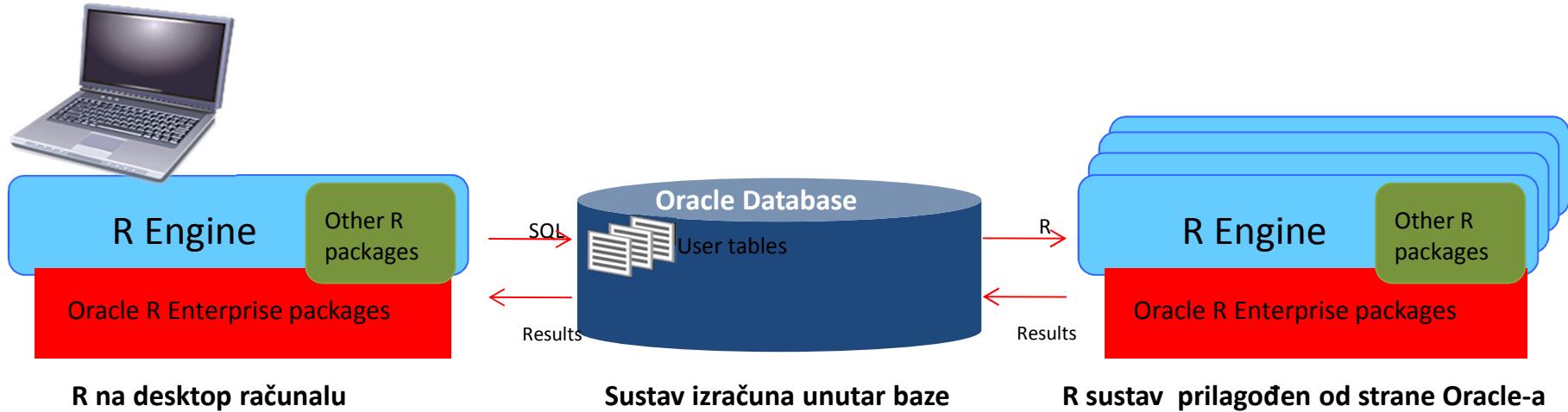


## Modeling



- Obuhvaćeni svi aspekti izrade modela: dohvati, transformacija, procesiranje podataka, te izrada i evaluacija modela
- Interaktivna vizualizacija i izrada izvještaja, uz set predefiniranih izvještaja i analitika
- Integriran u SQL developer, programiranje nepotrebno
- Tijek procesa gradnje modela očuvan unutar grafičkog workflow-a

# Oracle R Enterprise

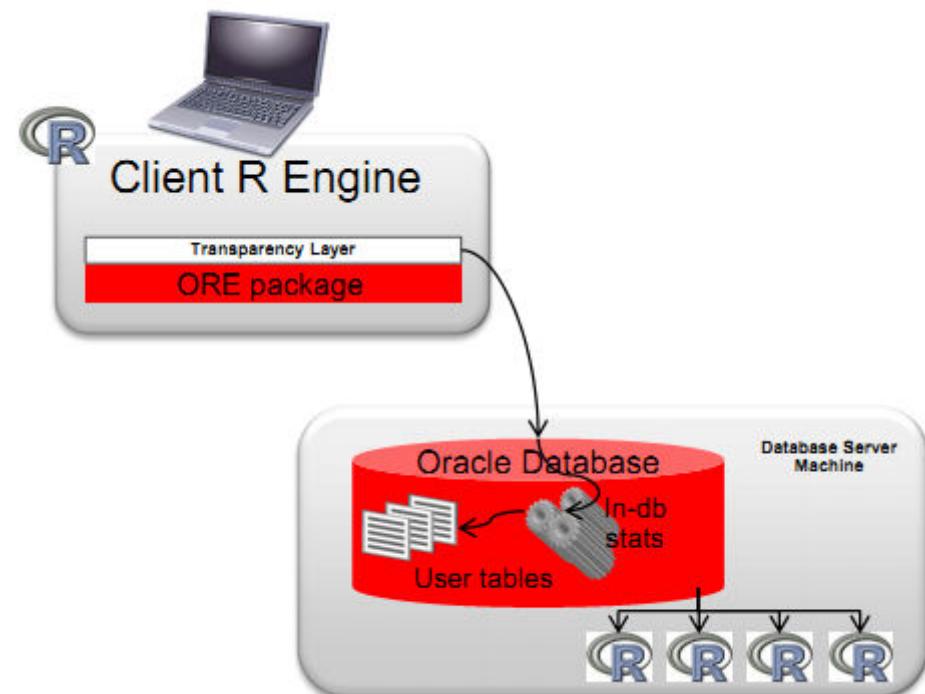


- R-SQL Transparency Framework presreće R funkcije i proslijeđuje ih serveru
- Transformacije podataka, statističke funkcije i napredne analitičke funkcije
- Grafički prikaz rezultata
- Tijek izvršavanja se nalazi unutar R skripte
- Omogućuje obradu velikih količina podataka
- Pristup tablicama, view- evima, eksternim tablica i DB linkovima
- Koristi SQL paralelizam
- Iskorištava postojeće statističke i data mining SQL funkcije i algoritme

- Skaliranje na više R sustava kako bi se iskoristio paralelizam
- Koristi map-reduce tip algoritma

# Oracle R Enterprise poboljšanja

- Eliminira problem memorije na klijentskom računalu
- Omogućuje paralelizaciju i optimizaciju upita na bazi
- Paralelizira izvršavanja R skripte multiplicirajući R engine
- Omogućuje pozivanje R skripti kroz SQL i PL/SQL



# Transparency Layer

SELECT primjer: dohvata podataka iz baze u klijent R

```
class(ONTIME_S)  
dim(ONTIME_S)  
ontime <- ore.pull(ONTIME_S)  
class(ontime)  
dim(ontime)
```



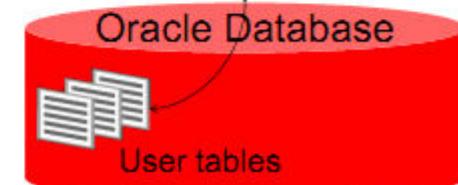
R user on desktop

Client R Engine

Other R packages

Transparency Layer  
Oracle R package

```
select *  
from ONTIME_S
```

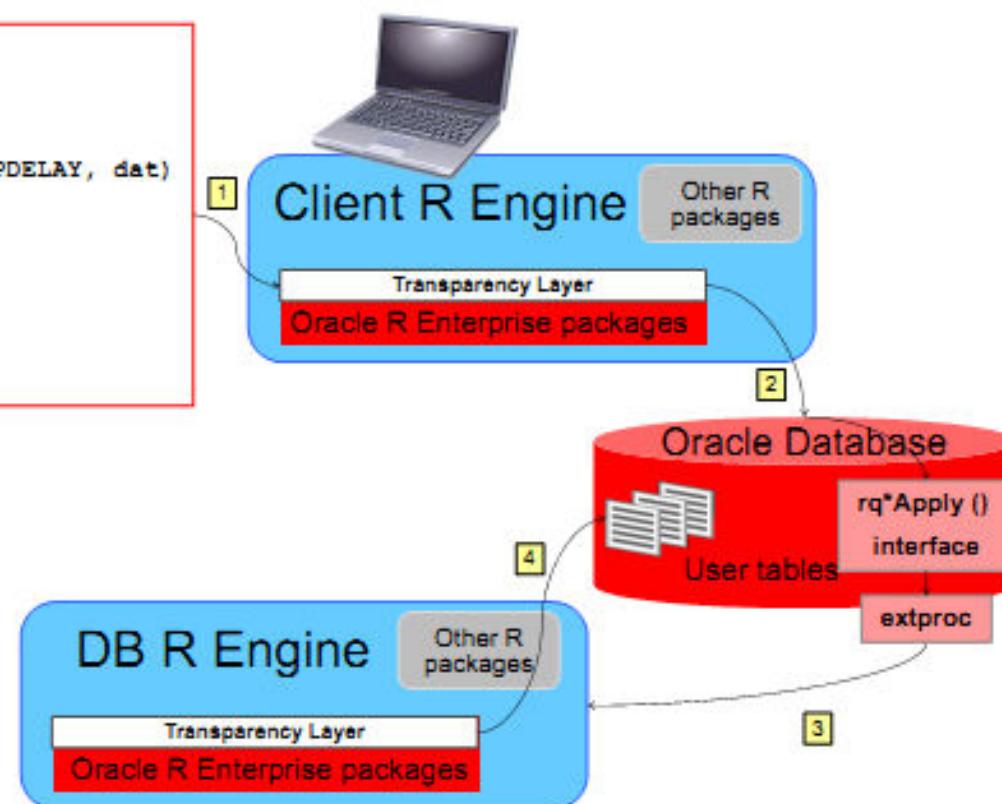


# R skripta na serveru (Embedded R Script)

Izvršavanje kroz R okolinu (generiran LM):

```
mod <- ore.doEval(  
  function(param) {  
    dat <- ore.pull(ONTIME_S)  
    mod <- lm(ARRDELAY ~ DISTANCE + DEPDELAY, dat)  
    mod  
  })  
mod_local <- ore.pull(mod)  
class(mod_local)  
summary(mod_local)
```

Goal: Build a single regression model using Transparency Layer in DB R Engine  
Data explicitly loaded into R memory at DB R Engine using ore.pull()  
Result "mod" returned as a model object



# R skripta na serveru (Embedded R Script)

R funkcije za embedded R srkipte:

R Interface function	Purpose
ore.doEval()	Invoke stand-alone R script
ore.tableApply()	Invoke R script with full table as input
ore.rowApply()	Invoke R script on one row at a time, or multiple rows in chunks
ore.groupApply()	Invoke R script on data partitioned by grouping column
ore.indexApply()	Invoke R script N times
ore.scriptCreate()	Create an R script in the database
ore.scriptDrop()	Drop an R script in the database

# Comprehensive R Archive Network

- Mreža R paketa koji proširuju osnovne funkcionalnosti R-a
- Paketi pisani u R, Javi, C i Fortran jeziku
- Preko 5800 dodatnih paketa



## Popis popularnijih paketa:

- Plyr
- Reshape2
- Stringr
- Ggplot2
- googleVis
- klaR
- Glmnet
- Survival
- Xml
- Parallel
- Xts

# Information Value

$$IV = \sum (DistributionGood_i - DistributionBad_i) \times \ln\left(\frac{DistributionGood_i}{DistributionBad_i}\right)$$

$$Weight of Evidence = \ln\left(\frac{DistributionGood_i}{DistributionBad_i}\right)$$

Age Group	Total Number of loans	Number of Bad loans	Number of Good Loans	% Bad loans	Name of Coarse Groups	Distribution of loans	Distribution Bad (DB)	Distribution Good (DG)	WOE	DG - DB	(DG - DB) * WOE
21-30	4821	206	4615	4.3%	G1	0.079	0.135	0.078	-0.553	-0.057	0.0318
30-36	10266	357	9909	3.5%	G2	0.169	0.235	0.167	-0.339	-0.067	0.0228
36-48	32926	776	32150	2.4%	G3	0.542	0.510	0.542	0.062	0.032	0.0020
48-60	12788	183	12605	1.4%	G4	0.210	0.120	0.213	0.570	0.092	0.0527
Total	60801	1522	59279							Information Value -->	0.1093

# ORE i Poziv paketa 1

```
1 # 1. Način izračuna IV vrijednosti varijabli
2 # Povlačenje podataka iz baze
3
4 library (klaR)
5 library (ORE)
6
7 #Oracle user connection
8 if(!ore.is.connected())
9   ore.connect
10 ore.sync()
11
12 ifm(list = ls(all = TRUE))
13 dt <- ore.pull(INSUR_CUST_LTV_SAMPLE_BIN)
14 grouping_column <- 'BUY_INSURANCE'
15
16
17
18 dt[is.na(dt)] <- "N/A" # zamjena null vrijednosti
19 for (i in which(sapply(dt, class) != "factor")) dt[[i]] <- as.factor(dt[[i]]) # Pretvaranje u faktore
20 gc <- dt[[grouping_column]]
21 dt[[grouping_column]] <- NULL
22 woemodel <- woe(dt, grouping=gc, appont=FALSE, zeroadj=0.5) # Izračun koristeći klaR paket
23 iv <- woemodel$IV
24 as.data.frame(iv)
```

	iv
AGE_BIN	0.08070162
BANK_FUNDS_BIN_Q	3.14069519
CAR_OWNERSHIP	0.06358286
MONEY_MONTLY_OVERDRA_BIN	1.80768571
N_TRANS_ATM	1.82629870
SALARY_BIN	0.02009627

# ORE i Poziv paketa 2

```
1 # 2. Način izračuna IV vrijednosti varijabli
2 # Povlačenje podataka iz baze i koristimo funkciju koja koristi klaR paket
3
4 library (ORE)
5
6 #oracle user connection
7 if(!ore.is.connected())
8   ore.connect
9 ore.sync()
10
11 rm(list = ls(all = TRUE))
12
13
14
15 # Definiranje funkcije za izračun IV koristeći klaR paket
16 iv <- function(x, grouping_column, ...) {
17   library(klaR)
18   x[is.na(x)] <- "N/A"
19   for (i in which(sapply(x, class) != "factor")) x[[i]] <- as.factor(x[[i]])
20   gc <- x[[grouping_column]]
21   x[[grouping_column]] <- NULL
22   woemodel <- woe(x, grouping=gc, appont=FALSE, zeroadj=0.5)
23   iv <- woemodel$IV
24   return(data.frame(name = names(iv), iv))           > grouping_column <- 'BUY_INSURANCE'
25 }
26
27 #-----
28
29 |
30 dt <- ore.pull(INSUR_CUST_LTV_SAMPLE_BIN)
31 grouping_column <- 'BUY_INSURANCE'
32
33 iv(dt,grouping_column)
```

	name	iv
1	AGE_BIN	0.08070162
2	BANK_FUNDS_BIN_Q	3.14069519
3	CAR_OWNERSHIP	0.06358286
4	MONEY_MONTLY_OVERDRA_BIN	1.80768571
5	N_TRANS_ATM	1.82629870
6	SALARY_BIN	0.02009627
	..	.

# ORE i Poziv paketa 3

```
1 # 3. Način izračuna IV vrijednosti varijabli
2 # slanje f-je kroz parametar
3
4 library (ORE)
5
6 #oracle user connection
7 if(!ore.is.connected())
8   ore.connect(user= [REDACTED])
9 ore.sync()
10
11 rm(list = ls(all = TRUE))
12
13
14
15 # Definiranje funkcije za izračun IV koristeći klaR paket
16 iv<- function(x, grouping_column, ...)
17 {
18   library(klaR)
19   x[is.na(x)] <- "N/A"
20   for (i in which(sapply(x, class) != "factor")) x[[i]] <- as.factor(x[[i]])
21   gc <- x[[grouping_column]]
22   x[[grouping_column]] <- NULL
23   woemodel <- woe(x, grouping=gc, appont=FALSE, zeroadj=0.5)
24   iv <- woemodel$IV
25   return(data.frame(name = names(iv), iv))           > grouping_column <- 'BUY_INSURANCE'
26 }           >
27
28
29 #-----          > ore.tableApply(dt,FUN =iv,grouping_column=grouping_column)
30
31
32 dt <- INSUR_CUST_LTV_SAMPLE_BIN
33 grouping_column <- 'BUY_INSURANCE'                  name      iv
34
35 ore.tableApply(dt,FUN =iv,grouping_column=grouping_column)
36
```

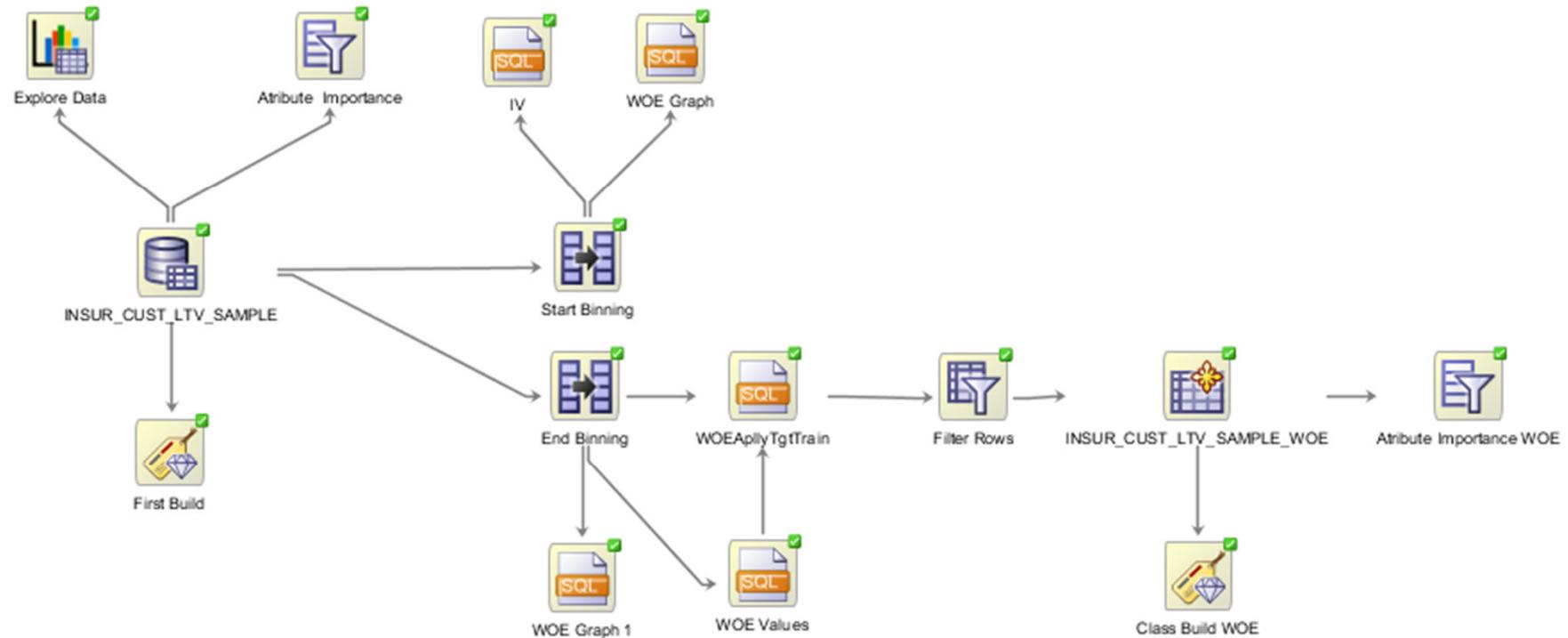
AGE_BIN		AGE_BIN 0.08070162
BANK_FUNDS_BIN_Q		BANK_FUNDS_BIN_Q 3.14069519
CAR_OWNERSHIP		CAR_OWNERSHIP 0.06358286
MONEY_MONTLY_OVERDRA_BIN		MONEY_MONTLY_OVERDRA_BIN 1.80768571
N_TRANS_ATM		N_TRANS_ATM 1.82629870
SALARY_BIN		SALARY_BIN 0.02009627

# ORE i Poziv paketa 4

```
1 # 4. Način izračuna IV vrijednosti varijabli
2 # Kreiranje f-je na bazi i njezin poziv
3
4 library (ORE)
5
6 #Oracle user connection
7 if(!ore.is.connected())
8   ore.connect(user= [REDACTED])
9 ore.sync()
10
11 rm(list = ls(all = TRUE))
12
13 # Definiranje funkcije za izračun IV koristeći klaR paket
14 ore.scriptDrop("woe.iv")
15 ore.scriptCreate("woe.iv",
16   function(x, grouping_column, ...)
17 {
18   library(klaR)
19   x[is.na(x)] <- "N/A"
20   for (i in which(sapply(x, class) != "factor")) x[[i]] <- as.factor(x[[i]])
21   gc <- x[[grouping_column]]
22   x[[grouping_column]] <- NULL
23   woemodel <- woe(x, grouping=gc, appont=FALSE, zeroadj=0.5)
24   iv <- woemodel$IV
25   return(data.frame(name = names(iv), iv))
26 }
27 )
28
29
30 #-----
31
32 dt <- INSUR_CUST_LTV_SAMPLE_BIN
33 grouping_column <- 'BUY_INSURANCE'
34
35 ore.tableApply(dt,FUN.NAME="woe.iv",grouping_column=grouping_column)
36
```

name	iv
AGE_BIN	0.08070162
BANK_FUNDS_BIN_Q	3.14069519
CAR_OWNERSHIP	0.06358286
MONEY_MONTLY_OVERDRA_BIN	MONEY_MONTLY_OVERDRA_BIN 1.80768571
N_TRANS_ATM	N_TRANS_ATM 1.82629870
SALARY_BIN	SALARY_BIN 0.02009627

# ODM WF i R paketi



# ODM WF i R paketi

Source Column: AGE

Transform Type: Binning

Output Column: AGE\_BIN  Auto

Binning

Binning Type: Custom

Custom bin values	
Bin Name	Lower Bound
1	No Lower Bound
2	29.0
3	41.0

**Histogram** **Statistics**

**AGE**

Percent

0 60

0 <= 8.4  
8.4 <= 1...  
16.8 <= ...  
25.2 <= ...  
33.6 <= ...  
42.0 <= ...  
50.4 <= ...  
58.8 <= ...  
67.2 <= ...  
75.6 <= ...

**AGE\_BIN**

Percent

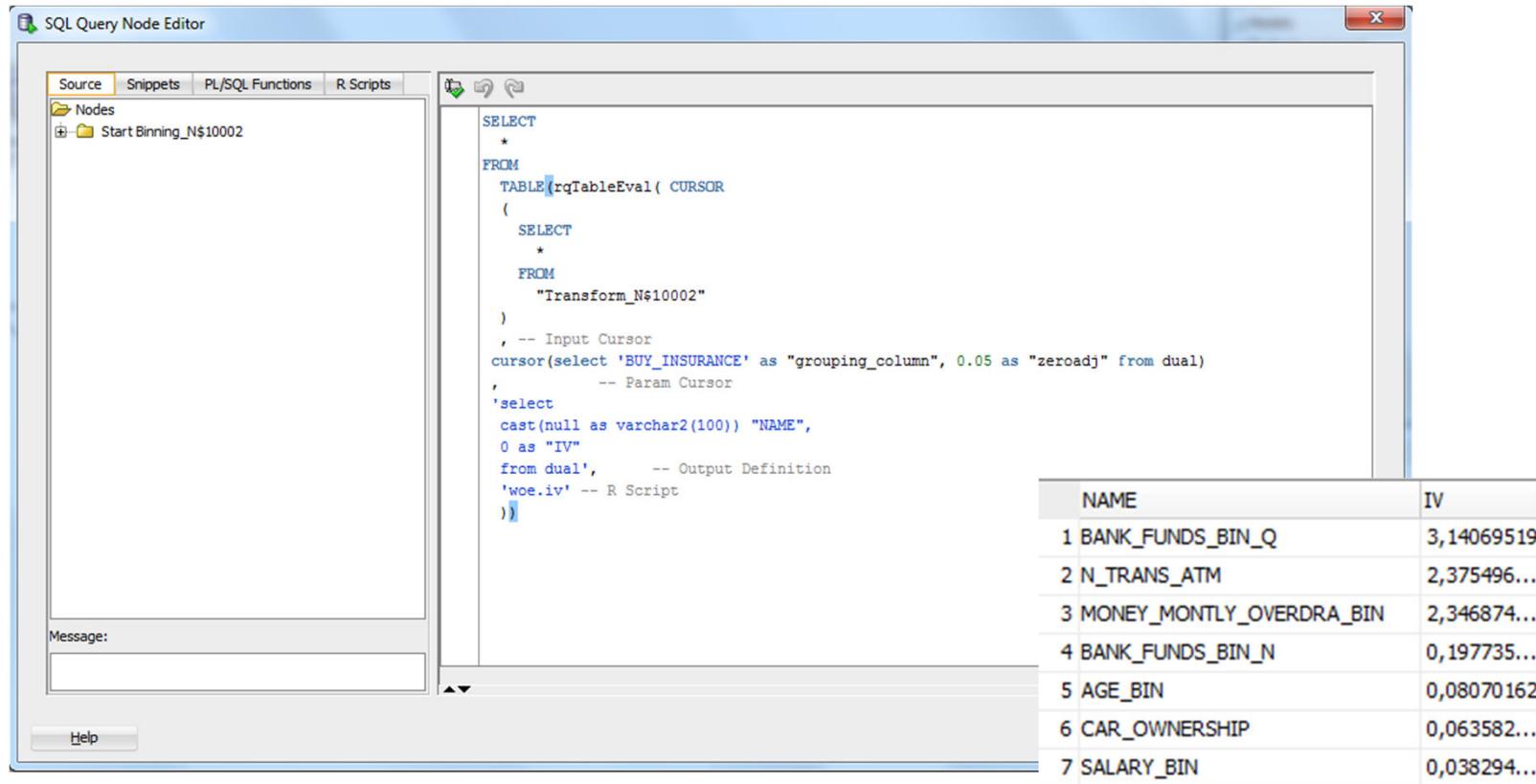
0 40 80

'1.' '2.' '3.'

Update Statistics when Finished

Status		
Name	Histogram	Data Type
AGE		NUMBER
BANK_FUNDS		NUMBER
BUY_INSURANCE		VARCHAR2
CAR_OWNERSHIP		NUMBER
MONEY_MONTLY_OVERDRAWN		NUMBER
N_TRANS_ATM		NUMBER
SALARY		NUMBER

# ODM WF i R paketi



The screenshot shows the SQL Query Node Editor interface. The left pane displays a tree view under the 'Nodes' section, with a single node named 'Start Binning\_N\$10002'. The right pane contains an R script and a preview table.

```
SELECT
  *
FROM
  TABLE(rqTableEval( CURSOR
  (
    SELECT
      *
    FROM
      "Transform_N$10002"
  )
  , -- Input Cursor
  cursor(select 'BUY_INSURANCE' as "grouping_column", 0.05 as "zeroadj" from dual)
  , -- Param Cursor
  'select
  cast(null as varchar2(100)) "NAME",
  0 as "IV"
  from dual',      -- Output Definition
  'woe.iv' -- R Script
))
```

The preview table on the right lists various bins and their IV values:

NAME	IV
1 BANK_FUNDS_BIN_Q	3,14069519
2 N_TRANS_ATM	2,375496...
3 MONEY_MONTLY_OVERDRA_BIN	2,346874...
4 BANK_FUNDS_BIN_N	0,197735...
5 AGE_BIN	0,08070162
6 CAR_OWNERSHIP	0,063582...
7 SALARY_BIN	0,038294...

# ODM WF i R paketi

SQL Functions    R Scripts

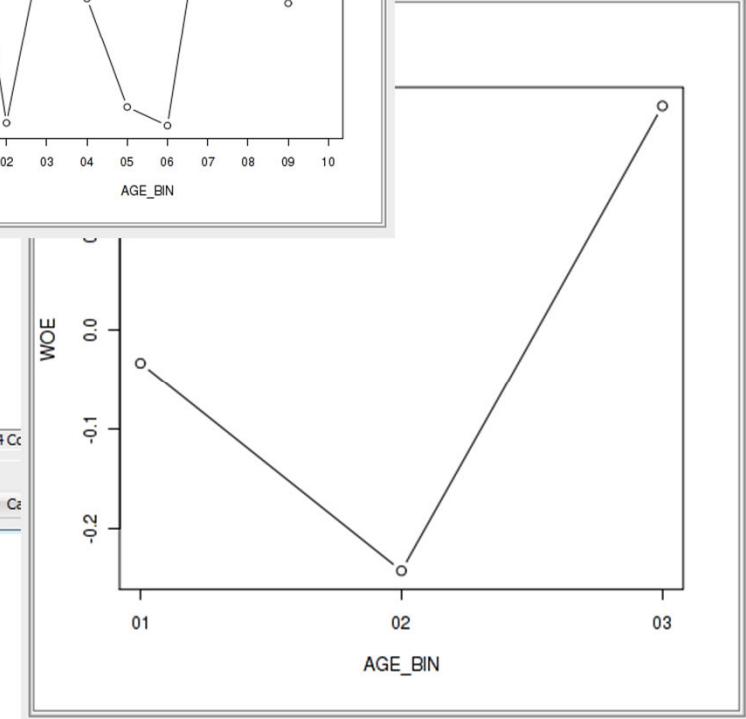
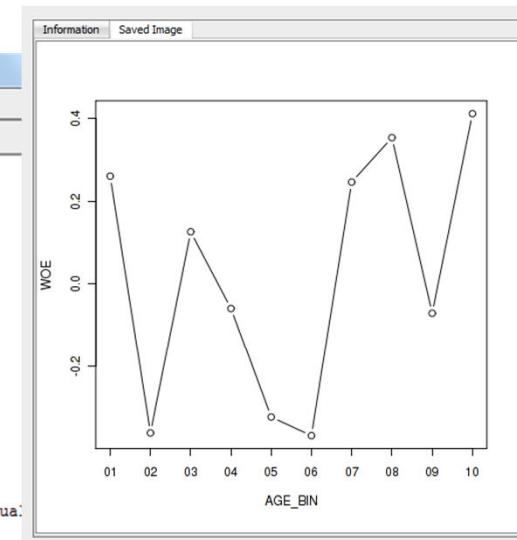
```

SELECT
*
FROM
  TABLE rqTableEval( CURSOR
(
  SELECT
    "End Binning_N$10012"."BUY_INSURANCE"
   , "End Binning_N$10012"."AGE_BIN"
   , "End Binning_N$10012"."BANK_FUNDS_BIN"
   , "End Binning_N$10012"."MONEY_MONTHLY_OVERDRA_BIN"
   , "End Binning_N$10012"."N_TRANS_ATM_BIN"
  FROM
    "End Binning_N$10012"
)
, -- Input Cursor
cursor(select 'BUY_INSURANCE' as "grouping_column", 0.05 as "zeroadj" from dual
      -- Param Cursor
'select
  cast(null as varchar2(100)) as "VARIABLE",
  cast(null as varchar2(100)) as "VAR_LEVEL",
  0 as "WOE"
  from dual',
      -- Output Definition
  'woe.woe2' -- R Script
) )

```

Line 24 Cc

OK    Cancel



# Zaključak

- Značajno proširenje funkcija R-a kroz CRAN pakete
- Omogućuje korištenje istih kroz R kod ali i kroz Oracle Data miner GUI

## Popis popularnijih paketa:

- Plyr
- Reshape2
- Stringr
- Ggplot2
- googleVis
- klaR
- Glmnet
- Surival
- Xml
- Parallel
- Xts



...Hvala!



## Q&A

kresimir.bokulic@multicom.hr  
branko.radovanovic@multicom.hr

**multicom**