The multiMiR user's guide

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May 20, 2015

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1 Introduction

microRNAs (miRNAs) regulate expression by promoting degradation or repressing translation of target transcripts. miRNA target sites have been catalogued in databases based on experimental validation and computational prediction using a variety of algorithms. Several online resources provide collections of multiple databases but need to be imported into other software, such as R, for processing, tabulation, graphing and computation. Currently available miRNA target site packages in R are limited in the number of databases, types of databases and flexibility. The R package multiMiR, with web server at http://multimir.ucdenver.edu, is a comprehensive collection of predicted and validated miRNA-target interactions and their associations with diseases and drugs. multiMiR includes several novel features not available in existing R packages: 1) compilation of 14 different databases, more than any other collection; 2) expansion of databases to those based on disease annotation and drug response, in addition to many experimental and computational databases; and 3) user-defined cutoffs for predicted binding strength to provide the most confident selection. The multiMiR package enables retrieval of miRNA-target interactions from 14 external databases in R without the need to visit all these databases. Advanced users can also submit SQL queries to the web server to retrieve results.

2 Getting to know the multiMiR database

The *multiMiR* web server (http://multimir.ucdenver.edu) hosts a database containing miRNA-target interactions from external databases. The package *multiMiR* provides functions to communicate with the *multiMiR* web server and its database. Information from each external database is stored in a table in the *multiMiR* database. To see a list of the tables, we can use the multimir_dbTables function.

```
> librarv(multiMiR)
> db.tables = multimir_dbTables()
> db.tables
   Tables_in_multimir
1
         diana_microt
2
                elmmo
3
           map_counts
4
         map_metadata
             metadata
6
            microcosm
          mir2disease
              miranda
```

```
9
               mirdb
10
           mirecords
11
               mirna
12
          mirtarbase
13
        pharmaco_mir
          phenomir
14
15
              pictar
16
                pita
17
             tarbase
18
              target
19
          targetscan
```

To display the database schema, we can use the multimir_dbSchema function.

```
> multimir_dbSchema()
-- Table structure for table `mirna`
DROP TABLE IF EXISTS `mirna`;
CREATE TABLE mirna (
 mature_mirna_uid INTEGER UNSIGNED AUTO_INCREMENT, -- mature miRNA unique ID
 org VARCHAR(4) NOT NULL,
                                                    -- organism abbreviation
 mature_mirna_acc VARCHAR(20) default NULL,
                                                    -- mature miRNA accession
 mature_mirna_id VARCHAR(20) default NULL,
                                                   -- mature miRNA ID/name
 PRIMARY KEY (mature_mirna_uid),
 KEY org (org),
 KEY mature_mirna_acc (mature_mirna_acc),
 KEY mature_mirna_id (mature_mirna_id)
);
-- Table structure for table `target`
DROP TABLE IF EXISTS `target`;
CREATE TABLE target (
  target_uid INTEGER UNSIGNED AUTO_INCREMENT,
                                               -- target gene unique ID
  org VARCHAR(4) NOT NULL,
                                               -- organism abbreviation
 target_symbol VARCHAR(80) default NULL,
                                               -- target gene symbol
  target_entrez VARCHAR(10) default NULL,
                                               -- target gene Entrez gene ID
  target_ensembl VARCHAR(20) default NULL,
                                               -- target gene Ensembl gene ID
 PRIMARY KEY (target_uid),
 KEY org (org),
 KEY target_symbol (target_symbol),
 KEY target_entrez (target_entrez),
 KEY target_ensembl (target_ensembl)
);
-- Table structure for table `mirecords`
```

```
DROP TABLE IF EXISTS `mirecords`;
CREATE TABLE `mirecords` (
 mature_mirna_uid INTEGER UNSIGNED NOT NULL,
                                               -- mature miRNA unique ID
 target_uid INTEGER UNSIGNED NOT NULL,
                                                -- target gene unique ID
  target_site_number INT(10) default NULL,
                                                -- target site number
  target_site_position INT(10) default NULL,
                                                -- target site position
  experiment VARCHAR(160) default NULL,
                                                -- supporting experiment
  support_type VARCHAR(40) default NULL,
                                                -- type of supporting experiment
 pubmed_id VARCHAR(10) default NULL,
                                                -- PubMed ID
 FOREIGN KEY (mature_mirna_uid)
    REFERENCES mirna(mature_mirna_uid)
    ON UPDATE CASCADE ON DELETE RESTRICT,
 FOREIGN KEY (target_uid)
    REFERENCES target(target_uid)
    ON UPDATE CASCADE ON DELETE RESTRICT
);
. . . . . .
```

(Please note that only three of the 19 tables are shown here for demonstration purpose.)

The function multimir_dbInfo will display information of external miRNA and miRNA-target databases in *multiMiR*, including version, release date, link to download the data, and the corresponding table in *multiMiR*.

```
> db.info = multimir_dbInfo()
> db.info
```

```
source_name source_version source_date
      map name
  {\tt diana\_microt}
                               DIANA-microT 5 Sept, 2013
                                                             Jan, 2011
                                      EIMMo
2
         elmmo
                                                        5
3
     microcosm
                                  MicroCosm
                                                        5
                                                            Sept, 2009
                                                          Mar 14, 2011
4
   mir2disease
                                miR2Disease
5
       miranda
                                   miRanda
                                                             Aug, 2010
6
         mirdb
                                      miRDB
                                                             Jan, 2012
                                                        4 Apr 27, 2013
7
     mirecords
                                 miRecords
8
                                 miRTarBase
                                                      4.5 Nov 1, 2013
    mirtarbase
9
  pharmaco_mir Pharmaco-miR (Verified Sets)
10
      phenomir
                                   PhenomiR.
                                                        2 Feb 15, 2011
11
                                     PicTar
                                                        2 Dec 21, 2012
          pita
12
                                       PITA
                                                        6 Aug 31, 2008
13
        tarbase
                                    TarBase
                                                        6
                                                                   2012
14
    targetscan
                                 TargetScan
                                                      6.2
                                                             Jun, 2012
```

source_url http://diana.imis.athena-innovation.gr/DianaTools/index.php?r=microT_CDS/index 1 2 http://www.mirz.unibas.ch/miRNAtargetPredictionBulk.php 3 http://www.ebi.ac.uk/enright-srv/microcosm/cgi-bin/targets/v5/download.pl http://www.mir2disease.org 4 5 http://www.microrna.org/microrna/getDownloads.do 6 http://mirdb.org 7 http://mirecords.biolead.org/download.php 8 http://mirtarbase.mbc.nctu.edu.tw/php/download.php 9 http://www.pharmaco-mir.org/home/download_VERSE_db http://mips.helmholtz-muenchen.de/phenomir/ 10 http://dorina.mdc-berlin.de

```
http://genie.weizmann.ac.il/pubs/mir07/mir07_data.html
http://diana.imis.athena-innovation.gr/DianaTools/index.php?r=tarbase/index
http://www.targetscan.org/cgi-bin/targetscan/data_download.cgi?db=vert_61
```

Among the 14 external databases, eight (DIANA-microT-CDS, ElMMo, MicroCosm, miRanda, miRDB, PicTar, PITA, and TargetScan) contain predicted miRNA-target interactions. Three of them (miRecords, miRTar-Base, and TarBase) have experimentally validated miRNA-target interactions. The remaining three databases (miR2Disease, Pharmaco-miR, and PhenomiR) contain miRNA-drug/disease associations.

To see how many records are in these 14 external databases we refer to the multimir_dbCount function.

```
> db.count = multimir_dbCount()
> db.count
       map_name human_count mouse_count rat_count total_count
  diana_microt
                    7664602
                                3747171
                                               0
                                                      11411773
1
2
          elmmo
                    3959112
                                 1449133
                                            547191
                                                       5955436
3
                     762987
                                 534735
                                            353378
                                                       1651100
      microcosm
4
    mir2disease
                       2875
                                      0
                                                          2875
                                                0
5
        miranda
                    5429955
                                 2379881
                                            247368
                                                       8057204
                                                       1180456
6
          mirdb
                     722269
                                 348778
                                            109409
7
      mirecords
                       2425
                                    449
                                               171
                                                          3045
8
     mirtarbase
                      47003
                                    9448
                                               331
                                                         56782
9
  pharmaco_mir
                        308
                                      5
                                                 0
                                                           313
10
       phenomir
                      15138
                                     491
                                                 0
                                                         15629
11
         pictar
                     404066
                                 302236
                                                        706302
12
                    7710936
                                 5163153
                                                      12874089
           pita
                                                Ω
13
        tarbase
                      23447
                                    9024
                                                67
                                                         32538
     targetscan
                    6298122
                                 2590814
                                                       8888936
> apply(db.count[,-1], 2, sum)
human_count mouse_count
                          rat_count total_count
   33043245
               16535318
                            1257915
                                        50836478
```

The current version of multiMiR contains nearly 50 million records.

3 List miRNAs, genes, drugs and diseases in the multiMiR database

In addition to functions displaying database and table information, the *multiMiR* package also provides the list.multimir function to list all the unique miRNAs, target genes, drugs, and diseases in the *multiMiR* database.

```
> miRNAs = list.multimir("mirna")
> dim(miRNAs)
```

```
[1] 4210
> head(miRNAs)
 mature_mirna_uid org mature_mirna_acc mature_mirna_id
                 1 hsa
                           MIMAT0000078 hsa-miR-23a-3p
                                         mmu-miR-434-3p
2
                 2 mm11
                           MIMAT0001422
3
                 3 mmu
                           MIMAT0001421
                                         mmu-miR-434-5p
                           MIMAT0000139 mmu-miR-127-3p
4
                 4 mmu
5
                 5 mmu
                           MIMAT0001420 mmu-miR-433-3p
                           MIMAT0001419 mmu-miR-433-5p
6
                 6 mmu
> genes = list.multimir("gene")
> dim(genes)
[1] 94792
> head(genes)
  target_uid org target_symbol target_entrez
                                                  target_ensembl
                                                 ENSG00000160221
           1 hsa
                      C21orf33
                                        8209
1
                                      353326 ENSMUSG00000085925
2
           2 mmu
                          Rtl1
                         SMAD1
                                                 ENSG00000170365
3
           3 hsa
                                        4086
4
           4 hsa
                        CXCL12
                                        6387
                                                 ENSG00000107562
5
           5 hsa
                        POU4F2
                                        5458
                                                 ENSG00000151615
6
           6 hsa
                          MYCN
                                        4613
                                                 ENSG00000134323
> drugs = list.multimir("drug")
> dim(drugs)
[1] 64 1
> head(drugs)
                   drug
1 3,3'-diindolylmethane
2
           5-fluoroucil
3
                abt-737
           alitretinoin
4
5
        arabinocytosine
       arsenic trioxide
> diseases = list.multimir("disease")
> dim(diseases)
[1] 223
> head(diseases)
1 ACTH-INDEPENDENT MACRONODULAR ADRENAL HYPERPLASIA; AIMAH
2
                        ACUTE LYMPHOBLASTIC LEUKEMIA (ALL)
3
                         ACUTE MYELOGENEOUS LEUKEMIA (AML)
                              ACUTE MYELOID LEUKEMIA (AML)
4
```

5

6

ADENOMA

ACUTE PROMYELOCYTIC LEUKEMIA (APL)

The current version of *multiMiR* has 4210 miRNAs and 94792 target genes from human, mouse, and rat, as well as 64 drugs and 223 disease terms. Depending on the speed of your Internet connection, it may take a few minutes to retrieve the large number of target genes.

4 Use get.multimir to query the multiMiR database

get.multimir is the main function in the package to retrieve predicted and validated miRNA-target interactions and their disease and drug associations from the *multiMiR* database.

To get familiar with the parameters in get.multimir, you can type ?get.multimir or help(get.multimir) in R. In the next section, many examples illustrate the use of the parameters.

5 Examples of multiMiR queries

In this section a variety of examples are described on how to query the multiMiR database.

5.1 Example 1: Retrieve all validated target genes of a given miRNA

In the first example, we ask what genes are validated targets of hsa-miR-18a-3p.

```
> # The default is to search validated interactions in human
> example1 = get.multimir(mirna='hsa-miR-18a-3p', summary=TRUE)
Searching mirecords ...
Searching mirtarbase ...
Searching tarbase ...
> names(example1)
[1] "validated" "summary"
> # Detailed information of the validated miRNA-target interaction
> head(example1$validated)
    database mature_mirna_acc mature_mirna_id target_symbol target_entrez target_ensembl
1 \quad {\tt mirecords} \qquad {\tt MIMAT0002891} \quad {\tt hsa-miR-18a-3p}
                                                         KRAS
                                                                        3845 ENSG00000133703
2 mirtarbase
                 MIMAT0002891 hsa-miR-18a-3p
                                                         ACLY
                                                                          47 ENSG00000260245
                 MIMAT0002891 hsa-miR-18a-3p
3 mirtarbase
                                                         ACT.Y
                                                                          47 ENSG00000131473
```

MIMAT0002891 hsa-miR-18a-3p

MIMAT0002891 hsa-miR-18a-3p

4 mirtarbase

5 mirtarbase

AP1B1

ARF5

162 ENSG00000100280

381 ENSG00000004059

```
MIMAT0002891 hsa-miR-18a-3p
6 mirtarbase
                                                    ATP5A1
                                                                     498 ENSG00000152234
                              experiment
                                                  support_type pubmed_id
1 Western blot//Luciferase activity assay
                                                                19372139
                                   CLASH Functional MTI (Weak) 23622248
3
                                   CLASH Functional MTI (Weak) 23622248
                                   CLASH Functional MTI (Weak) 23622248
4
5
                                   CLASH Functional MTI (Weak)
                                                                23622248
                                   CLASH Functional MTI (Weak) 23622248
6
> # Which interactions are supported by Luciferase assay?
> example1$validated[grep("Luciferase", example1$validated[,"experiment"]),]
    database mature_mirna_acc mature_mirna_id target_symbol target_entrez target_ensembl
   mirecords MIMAT0002891 hsa-miR-18a-3p
                                                       KRAS
                                                                     3845 ENSG00000133703
48 mirtarbase
                 MIMAT0002891 hsa-miR-18a-3p
                                                       KRAS
                                                                     3845 ENSG00000133703
                                                     support_type pubmed_id
                                        experiment
           Western blot//Luciferase activity assay
48 Luciferase reporter assay//qRT-PCR//Western blot Functional MTI 19372139
> example1$summary[example1$summary[,"target_symbol"] == "KRAS",]
 mature_mirna_acc mature_mirna_id target_symbol target_entrez target_ensembl mirecords mirtarbase
     MIMAT0002891 hsa-miR-18a-3p
                                           KRAS
                                                         3845 ENSG00000133703
  validated.sum all.sum
```

It turns out that KRAS is the only target validated by Luciferase assay. The interaction was recorded in miRecords and miRTarBase and supported by the same literature, whose PubMed ID is in column 'pubmed_id'. The summary (by setting "summary=TRUE" when calling get.multimir) shows the number of records in each of the external databases and the total number of databases supporting the interaction.

5.2 Example 2: Retrieve miRNA-target interactions associated with a given drug or disease

In this example we would like to know which miRNAs and their target genes are associated with Cisplatin, a chemotherapy drug used in several cancers.

```
> example2 = get.multimir(disease.drug='cisplatin', table='disease.drug')
Searching mir2disease ...
Searching pharmaco_mir ...
Searching phenomir ...
> names(example2)
[1] "disease.drug"
> nrow(example2$disease.drug)
```

> head(example2\$disease.drug)

```
database mature_mirna_acc mature_mirna_id target_symbol target_entrez target_ensembl
1 pharmaco_mir MIMAT0000772 hsa-miR-345-5p
                                                         ABCC1
                                                                        4363 ENSG00000103222
2 pharmaco_mir
                   MIMAT0000720 hsa-miR-376c-3p
                                                         ALK7
               MIMAT0000423 hsa-miR-125b-5p
3 pharmaco_mir
                                                         BAK1
                                                                         578 ENSG00000030110
4 pharmaco_mir
                                                         BCL2
                                                                         596 ENSG00000171791
                                     hsa-miR-34
                MIMAT0000318 hsa-miR-200b-3p
MIMAT0000617 hsa-miR-200c-3p
5 pharmaco_mir
                                                         BCL2
                                                                         596 ENSG00000171791
                                                         BCL2
                                                                         596 ENSG00000171791
6 pharmaco_mir
 {\tt disease\_drug~paper\_pubmedID}
    cisplatin
                    20099276
    cisplatin
                     21224400
    cisplatin
3
                     21823019
     cisplatin
                     18803879
     cisplatin
5
                     21993663
    cisplatin
                     21993663
```

get.multimir returns 53 miRNA-target pairs. For more information, we can always refer to the published papers with PubMed IDs in column 'paper_pubmedID'.

5.3 Example 3: Select miRNAs predicted to target a gene

get.multimir also takes target gene(s) as input. In this example we retrieve miRNAs predicted to target Gnb1 in mouse. For predicted interactions, the default is to query the top 20% predictions within each external database, which is equivalent to setting parameters "predicted.cutoff = 20" and "predicted.cutoff.type = 'p'" (for percentage cutoff). Here we search the top 35% among all conserved and nonconserved target sites.

```
> example3 = get.multimir(org="mmu", target="Gnb1", table="predicted", summary=TRUE,
+ predicted.cutoff=35, predicted.cutoff.type="p", predicted.site="all")

Searching diana_microt ...
Searching elmmo ...
Searching microcosm ...
Searching miranda ...
Searching miranda ...
Searching pictar ...
Searching pita ...
Searching targetscan ...
> names(example3)

[1] "predicted" "summary"
> head(example3$predicted)
```

```
database mature_mirna_acc mature_mirna_id target_symbol target_entrez
                                                                                target_ensembl
                  MIMAT0000663
                                                                      14688 ENSMUSG00000029064
1 diana_microt
                                  mmu-miR-218-5p
                                                          Gnb1
2 diana microt
                  MTMAT0017276
                                 mmu-miR-493-5p
                                                          Gnb1
                                                                      14688 ENSMUSG00000029064
3 diana_microt
                 MIMAT0000656
                                mmu-miR-139-5p
                                                          Gnb1
                                                                      14688 ENSMUSG00000029064
                MIMAT0014946 mmu-miR-3074-2-3p
4 diana_microt
                                                          Gnb1
                                                                       14688 ENSMUSG00000029064
                                                                      14688 ENSMUSG00000029064
5 diana_microt
                 MIMAT0000144
                                mmu-miR-132-3p
                                                          Gnb1
6 diana_microt
                  MIMAT0020608
                                    mmu-miR-5101
                                                          Gnb1
                                                                       14688 ENSMUSG00000029064
 score
1 0.975
2 0.964
3 0.96
4 0.921
5 0.92
6 0.918
> head(example3$summary)
```

	mature	e_mirna_acc	mature.	_mirna_	id tar	get_s	ymbol ·	target	_entrez	ta	rget	_ensembl	diana_microt
1	M	MAT0000133	mmu-mil	R-101a-	-3p		Gnb1		14688	ENSMUS	G000	00029064	1
2	M	MAT0000616	mmu-mil	R-101b-	-3p		Gnb1		14688	ENSMUS	G000	00029064	1
3	M]	MAT0003476	mmu-mil	R-669b-	-5p		Gnb1		14688	ENSMUS	G000	00029064	1
4	M]	MAT0000663	mmu-m:	iR-218-	-5p		Gnb1		14688	ENSMUS	G000	00029064	1
5	M	MAT0002106	mmu-mil	R-465a-	-5p		Gnb1		14688	ENSMUS	G000	00029064	1
6	M	MAT0003739	mmu-m:	iR-673-	-5p		Gnb1		14688	ENSMUS	G000	00029064	1
	${\tt elmmo}$	microcosm	miranda	${\tt mirdb}$	pictar	pita	targe	tscan	predicte	ed.sum	all.	sum	
1	1	1	1	0	2	0		1		6		6	
2	1	1	1	0	2	0		1		6		6	
3	0	0	1	1	0	1		1		5		5	
4	2	0	0	0	0	2		2		4		4	
5	1	0	1	0	0	0		2		4		4	
6	0	0	0	0	2	1		1		4		4	

The records in *example3\$predicted* are ordered by scores from best to worst within each external database. Once again, the summary option allows us to examine the number of target sites predicted by each external database and the total number of databases predicting the interaction.

Finally we examine how many predictions each of the databases has.

```
> apply(example3$summary[,6:13], 2, function(x) sum(x>0))
```

diana_microt	elmmo	microcosm	miranda	mirdb	pictar	pita
108	53	5	44	1	9	132
targetscan						
58						

5.4 Example 4: Select miRNA(s) predicted to target most, if not all, of the genes of interest

You may have a list of genes involved in a common biological process. It is interesting to check whether some, or all, of these genes are targeted by the same miRNA(s). Here we have four genes involved in chronic obstructive

pulmonary disease (COPD) in human and want to know what miRNAs target these genes by searching the top 500,000 predictions in each external database.

```
> example4 = get.multimir(org='hsa', target=c('AKT2','CERS6','S1PR3','SULF2'), table='predicted',
+ summary=TRUE, predicted.cutoff.type='n', predicted.cutoff=500000)
Searching diana_microt ...
Searching elmmo ...
Searching microcosm ...
Searching miranda ...
Searching mirdb \dots
Searching pictar ...
Searching pita ...
Searching targetscan ...
   Then we count the number of target genes for each miRNA.
> example4.counts = addmargins(table(example4$summary[,2:3]))
> example4.counts = example4.counts[-nrow(example4.counts),]
> example4.counts = example4.counts[order(example4.counts[,5], decreasing=TRUE),]
> head(example4.counts)
              target_symbol
mature_mirna_id AKT2 CERS6 S1PR3 SULF2 Sum
              1 1 0
 hsa-miR-4282
                                1
                      1
                                  1 3
 hsa-miR-429
                 1
                            0
 hsa-miR-524-5p 1 1 0 1 3
 hsa-miR-548p
                0 1 1 1 3
 hsa-miR-876-5p 0 1
                          1
                                  1
                                      3
 hsa-let-7a-5p
                 1
                             0
```

5.5 Example 5: Retrieve interactions between a set of miR-NAs and a set of genes

In this example, we profiled miRNA and mRNA expression in poorly metastatic bladder cancer cell lines T24 and Luc, and their metastatic derivatives FL4 and Lul2, respectively. We identified differentially expressed miRNAs and genes between the metastatic and poorly metastatic cells. Let's load the data.

```
> load(url("http://multimir.ucdenver.edu/bladder.rda"))
```

Variable DE.miRNA.up contains 9 up-regulated miRNAs and variable DE.entrez.dn has 47 down-regulated genes in the two metastatic cell lines. The hypothesis is that interactions between these miRNAs and genes whose expression changed at opposite directions may play a role in cancer metastasis. So we use multiMiR to check whether any of the nine miRNAs could target any of the 47 genes.

```
> # search all tables & top 10% predictions
> example5 = get.multimir(org="hsa", mirna=DE.miRNA.up, target=DE.entrez.dn, table="all",
+ summary=TRUE, predicted.cutoff.type="p", predicted.cutoff=10)
Searching diana_microt ...
Searching elmmo ...
Searching microcosm ...
Searching miranda ...
Searching mirdb ...
Searching pictar ...
Searching pita ...
Searching targetscan ...
Searching mirecords ...
Searching mirtarbase ...
Searching tarbase ...
Searching mir2disease ...
Searching pharmaco_mir \dots
Searching phenomir ...
```

In the result, there are 3 unique miRNA-gene pairs that have been validated.

> example5\$validated

```
database mature_mirna_acc mature_mirna_id target_symbol target_entrez
1 mirtarbase MIMAT0000087 hsa-miR-30a-5p
                                                   FDX1
                MIMAT0000087 hsa-miR-30a-5p
                                                   LIMCH1
                                                                  22998
2 mirtarbase
                                                  FDX1
                                                                  2230
3
    tarbase
                MIMAT0000087 hsa-miR-30a-5p
                MIMAT0000424
                                                     NEK2
    tarbase
                                hsa-miR-128
                                                                   4751
    tarbase
                MIMAT0000087 hsa-miR-30a-5p
                                                  LIMCH1
                                                                  22998
  target ensembl
                              experiment
                                                 support_type pubmed_id
1 ENSG00000137714
                               Proteomics Functional MTI (Weak) 18668040
2 ENSG00000064042 pSILAC//Proteomics;Other Functional MTI (Weak)
                                                                18668040
3 ENSG00000137714
                               Proteomics
                                                      positive
4 ENSG00000117650
                               Microarray
                                                      positive
5 ENSG00000064042
                               Proteomics
                                                      positive
```

Two miRNAs are associated with bladder cancer in miR2Disease and PhenomiR.

> example5\$disease_drug[grep("bladder", example5\$disease_drug\$disease_drug, ignore.case=TRUE),]

```
database mature_mirna_acc mature_mirna_id target_symbol target_entrez
18 mir2disease
                    MIMAT0000418 hsa-miR-23b-3p
                                                           NA
                                                                          NΑ
711
      phenomir
                    MIMAT0000418 hsa-miR-23b-3p
                                                           NA
                                                                          NA
      phenomir
                    MIMAT0000449 hsa-miR-146a-5p
                                                           NA
                                                                          NA
    target_ensembl disease_drug
18
               NA bladder cancer
               NA Bladder cancer
711
               NA Bladder cancer
                                              paper_pubmedID
18 2007. Micro-RNA profiling in kidney and bladder cancers.
711
                                                    17826655
311
                                                    19127597
```

The predicted databases predict 65 miRNA-gene pairs between the 9 miRNAs and 28 of the 47 genes.

```
> length(unique(example5$predicted$mature_mirna_id))
[1] 9
> length(unique(example5$predicted$target_entrez))
[1] 28
> unique.pairs = unique(data.frame(miRNA.ID=as.character(example5$predicted$mature_mirna_id),
+ target.Entrez=as.character(example5$predicted$target_entrez)))
> nrow(unique.pairs)
[1] 65
> head(unique.pairs)
        miRNA.ID target.Entrez
1 hsa-miR-182-5p
2 hsa-miR-182-5p
                          1112
3 hsa-miR-30d-5p
                         22998
4 hsa-miR-30a-5p
                         22998
5 hsa-miR-30b-5p
                         22998
6 hsa-miR-182-5p
                          5962
```

Results from each of the predicted databases are already ordered by their scores from best to worst.

```
> example5.split = split(example5$predicted, example5$predicted$database)
```

6 Direct query to the database on the multiMiR web server

As shown previously, get.multimir is the main function to retrieve information from the *multiMiR* database, which is hosted at http://multimir.ucdenver.edu. The function builds one SQL query for every external database that the user is going to search, submits the query to the web server, and parses, combines, and summarizes results from the web server. For advanced users, there are a couple ways to query the *multiMiR* database without using the *multiMiR* package; but they have to be familiar with SQL queries. In general, users are still advised to use the get.multimir function when querying multiple external databases in *multiMiR*.

6.1 Direct query on the web server

The *multiMiR* package communicates with the *multiMiR* database via the script http://multimir.ucdenver.edu/cgi-bin/multimir.pl on the web server. To show all tables in the database, the following URL can be typed in the address bar of a web browser.

http://multimir.ucdenver.edu/cgi-bin/multimir.pl?query=show tables

The content displayed on the resulting web page is similar with what is returned by typing $multimir_dbTables()$ in R. Once again, data from each of the external databases is stored in a table in multiMiR. There are also tables for miRNAs (table mirna) and target genes (table target).

To learn about the structure of a table (e.g. DIANA-microT data in table diana_microt), users can use URL

http://multimir.ucdenver.edu/cqi-bin/multimir.pl?query=describe diana_microt

Similar with Example 1, the following URL searches for validated target genes of hsa-miR-18a-3p in miRecords.

http://multimir.ucdenver.edu/cgi-bin/multimir.pl?query=SELECT m.mature_mirna_acc, m.mature_mirna_id, t.target_symbol, t.target_entrez, t.target_ensembl, i.experiment, i.support_type, i.pubmed_id FROM mirna AS m INNER JOIN mirecords AS i INNER JOIN target AS t ON (m.mature_mirna_uid=i.mature_mirna_uid and i.target_uid=t.target_uid) WHERE m.mature_mirna_id='hsa-miR-18a-3p'

As you can see, the query is long and searches just one of the three validated tables in *multiMiR*. While in Example 1, one line of R command using the get.multimir function searches, combines and summarizes results from all three validated external databases (miRecords, miRTarBase and TarBase).

6.2 Direct query in R

The same direct queries we did above on the web server can be done in R as well. To show all tables in the database:

> direct1 = search.multimir(query="show tables")

These are equivalent to using the multimir_dbTables function as showed previously.

To show the structure of table diana_microt:

```
> direct2 = search.multimir(query="describe diana_microt")
> direct2
                              Type Null Key Default Extra
            Field
1 mature_mirna_uid int(10) unsigned
                                    NO MUL
2
       target_uid int(10) unsigned
                                     NO MUL
                            double
3
                                     NO MUL
       miTG_score
4
         UTR3_hit int(10) unsigned
                                     NO
5
          CDS_hit int(10) unsigned
                                     NO
```

To search for validated target genes of hsa-miR-18a-3p in miRecords:

> direct3 = search.multimir(query="select m.mature_mirna_acc, m.mature_mirna_id, t.target_symbol, t.target_entrez, t

7 Session Info

```
> sessionInfo()
R version 3.1.2 (2014-10-31)
Platform: x86_64-pc-linux-gnu (64-bit)
locale:
 [1] LC_CTYPE=en_US.UTF-8
                               LC_NUMERIC=C
                                                          LC_TIME=en_US.UTF-8
                               LC_MONETARY=en_US.UTF-8
 [4] LC_COLLATE=C
                                                          LC_MESSAGES=en_US.UTF-8
 [7] LC_PAPER=en_US.UTF-8
                               LC_NAME=C
                                                          LC_ADDRESS=C
                               LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C
[10] LC_TELEPHONE=C
attached base packages:
[1] stats
             graphics grDevices utils
                                           datasets methods
                                                               base
other attached packages:
[1] multiMiR_2.0
loaded via a namespace (and not attached):
[1] RCurl_1.95-4.5 XML_3.98-1.1 bitops_1.0-6 tools_3.1.2
> warnings()
NULL
```