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# The Basin of Mexico Hydrogeological Database (BMHDB): Implementation, queries and interaction with open source software

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## Abstract

Integrated Water Management at the Basin level is a concept that was introduced in the 90s and is a goal in every national and local water management plan. Unfortunately this goal has not been achieved mainly due to a lack of both tools and data management, as data must be gathered from different sources and in different formats. Compounding this problem is the fact that in some regions different water agencies are in charge of water supply as is the case in the Basin of Mexico, in which Mexico City and its Metropolitan Zone are located. The inhabitants of the Basin of Mexico, which comprises five different political entities and in which different agencies are in charge of water supply rely on the Basin's aquifer system as its main water supply source. However, a regional hydrogeological database in this area does not exist which is why the use of both a Relational Database Management System (RDMBS) and a Geographic Information System (GIS) is proposed in order to improve regional data management in the study area. Data stored in this new database, the Basin of Mexico Hydrogeological Database (BMHDB) comprises data on climatological, borehole and runoff variables, readily providing in-

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formation for the development of hydrogeological models. A simple example is used to show how geostatistical analysis can be done using the data directly from the BMHDB. The structure of the BMHDB allows easy maintenance and updating, representing a valuable tool for the development of regional studies.

*Key words:* GIS, Spatial Database, Groundwater Management, Open Source Software, Mexico City

# 1 1 Introduction

The concept of water management evolved from a piece meal approach to that of a Basin level management after the International Conference on Water and Environment in 1992, which resulted in the Dublin statement (ICWE, 1992). This concept shifted to integrated water resources development and management in Rio, later in that same year as expressed in chapter 18 of Agenda 21 (UNCED, 1992). Behind this idea was the introduction of both land and water related aspects of water management at the Basin level as well as stake holder participation. However, this seldom occurs in practice, mainly due to a lack of both adequate data management and proper tools to achieve an integrated river basin approach.

In an integrated water management approach, the development of regional 12 hydrogeologic models are required in order to predict the impact of differ-13 ent land and water management policies in the future and all data required 14 should be easily accessible to decision makers and modelers. Data acces-15 sibility to several users can be provided by a Relational Database Man-16 agement System (RDMBS) and it can incorporate data such as location of 17 wells, pumping rates, groundwater table elevation, lithology records, con-18 centration of trace metals as well as chemical and physical parameters of the 19 groundwater. The same database can include climatological variables (e.g. 20

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<sup>21</sup> precipitation, temperature, evaporation) thus making it possible to under-

<sup>22</sup> take spatial and time series analysis of these variables.

The use of a Geographic Information System (GIS) can help to visualize and update the existing database as superposition of different thematic layers can be accomplished in order to verify existing data and existing modules can be used on the database (e.g. geostatistics). The database structured in this way can be queried with the use of Structured Query Language (SQL) statements and new tables can be formed from existing data.

Although the use of a GIS can help to visualize existing data through the 29 simultaneous display of different layers or 3-D views, statistical analysis 30 can be done without the use of a GIS. The relational database PostgreSQL 31 (http://www.postgresql.org) was selected in the present work as it can 32 be linked to the statistical language R (R Development Core Team, 2005) 33 which is an open source project similar to the S language. R provides li-34 braries for statistical analysis. Another advantage of postgreSQL is that it 35 can be linked to the Open Source GIS GRASS (http://grass.itc.it) which 36 provides tools for raster, vector and point analysis as well as tools for image 37 processing. In addition, postgreSQL can handle spatial attributes such as 38 points, polygons or lines by using the postGIS extension (http://www/refractions/postgis) 39 which makes it possible to undertake spatial queries to the database. 40

The objective of this work is to present a database management system for
the Basin of Mexico, providing a framework that can be applied to any other
study area. The database comprises data previously available in different
locations and formats in order to make it available to all interested users.
This database can be accessed using Open Source software, freely available
from the internet in order to make data accessible to people who can not
acquire proprietary software due to its cost.

## **2** The Basin of Mexico

The Basin of Mexico (referred to as Basin in the remainder part of the paper) with an approximate area of 9,600 km<sup>2</sup> encloses one of the largest cities in the world: Mexico City and its Metropolitan Zone (MCMZ). The Basin is <sup>52</sup> located in the central part of Mexico and is enclosed by mountains as high

as 5500 masl (Fig. 1) while the valley's mean elevation, where Mexico City

<sup>54</sup> is located is near 2240 masl.



Fig. 1. Location, Digital Elevation Model and political boundaries for the Basin of Mexico. Coordinates are in km for UTM–14; elevations are in meters above sea level.

The Basin's aquifer system is the most important part of the water supply 55 system to its inhabitants and its exploitation started in 1847, when the first 56 well was drilled (Ortega and Farvolden, 1989) a number which by 1990 had 57 increased to 3537 officially registered wells in the MCMZ (NRC, 1995). This 58 heavy dependence on the aquifers has had its toll and a decline in the po-50 tentiometric level of up to 80 meters was recorded by 2002 in some areas 60 (Edmunds et al., 2002). Compounding this problem, the Basin comprises 61 five different political entities (Fig. 1); accordingly, different governmen-62 tal agencies are in charge of water supply, the most important being the 63 Comisión Nacional del Agua (CNA) and the Dirección General de Construcción 64 у Operación Hidráulica (DGCOH). The CNA has under its charge the Gerencia 65 *Regional de Aguas del Valle de México* (GRAVAMEX) which in conjunction with 66

the DGCOH operates the water supply infrastructure for the MCMZ. However, water management at the basin level is not fulfilled as these agencies operate on their own, making it difficult to share information between
them.

The need for accessible and up-to-date data at the Basin level is shown in recent studies undertaken within the Basin of Mexico as they have considered
only subareas of the Basin or rely on short term records such as Birkle et al.
(1998) who used rainfall data for the 1980-1985 period to develop a "longterm" water balance.

#### 76 3 Improving data management

Data required for any type of surface or groundwater study in the Basin are 77 currently spread throughout different agencies in charge of water supply 78 and even within these agencies data are found in different reports. Further-79 more, the existing databases are limited to particular data such as climato-80 logical or run-off data. In order to improve water management in the Basin 81 and to foster an Integrated Water Management approach in the study area, 82 the Basin of Mexico Hydrogeological Database (BMHDB) has been devel-83 oped using both a Relational Database Management System (RDBMS) and 84 a Geographic Information System (GIS). Regarding well related data, the 85 BMHDB comprises monitoring wells from both CNA and DGCOH, allowed 86 extraction volumes from those wells registered at the *Registro Público de* 87 Derechos de Agua (REPDA) and annual extraction rates for those wells reg-88 istered at DGCOH. Additionally, the database contains lithology records, 89 pumping tests and chemical data for some of the wells. Climatological data 90 (i.e. rainfall, minimum and maximum temperature) are available on a daily, 91 monthly and annual basis, as are run-off date (volumes and flows). This in-92 formation, which is currently distributed in the water supply agencies (DG-93 COH, CNA) and in previous studies realized in other areas of the Basin was 94 gathered in order to develop this new database. The information gathered 95 so far was obtained in different formats, such as spreadsheet files, shape 96 files, hard-copy maps (e.g. soils and land-use), hand written tables and re-97 ports, which had to be processed and georefenced in order to provide read<sup>99</sup> ily accessible data. The tables can be updated through the use of simple SQL
<sup>100</sup> command such as insert or copy.

#### 101 3.1 Existing databases

There are currently two databases in Mexico which contain data required in
 hydrogeological studies. The databases that are available to any user are the
 *Extractor Rápido de Información Meteorológica* (ERIC), (IMTA, 1990) and *Banco Nacional de Datos de Aguas Superficiales* (BANDAS), (IMTA, 1995) which are
 briefly explained below.

(1) ERIC: This database is distributed on one CD which includes nation-107 wide daily meteorological data: Rainfall, pan evaporation, minimum 108 temperature, maximum temperature, average temperature, storm (0=no 109 storm 1=storm), overcast conditions (0,1,2) and hail. The data stored on 110 the CD have to be copied to the user's hard disk and accessed through 111 the DOS command line. To query this database the user's input is re-112 quired; the user needs to type the desired query in a specific order on 113 the command-line: 1) variable selection (e.g. rainfall, evaporation), 2) 114 station selection (one station, all stations, rectangular, polygon or state-115 wide selection) 3) time interval (one day, one period or one period over 116 several years). The output of this query is an ASCII file with text and 117 data which needs to be formatted and cleaned in order to undertake 118 any type of statistical analysis. 119

(2) BANDAS: This database was developed by the Instituto Mexicano de Tec-120 nología del Agua and as ERIC, it comprises nation-wide data for Mexico. 121 It is distributed as six CDs which are available from IMTA; the first of 122 these CDs provides the installation program and is required in order to 123 access the data. The information stored in this database is organized in 124 13 hydrological regions and in order to query it the user has to make a 125 predetermined number of selections which can only be made through 126 a scroll-menu. First the user has to select the hydrometric station of 127 interest and then click on an icon to query the selected station which 128 brings up another window. On this window the user is presented with 129 different options through selection boxes which can not be selected si-130

multaneously (and which in some cases are repetitive): monthly data,
mean daily flows, flow records greater than a user-defined threshold,
average and extreme annual flows, daily hydrometric data (flow and
volume), monthly and annual hydrometric data. The way in which this
database is structured makes it tedious to gather data for more than
one year. As ERIC, the output file contains text and relevant data.

## <sup>137</sup> 3.2 Drawbacks of the existing databases

In order to undertake any type of statistical analysis with the output data
from either ERIC or BANDAS, the data have to be processed in order to clean
from them additional information printed by these databases. In summary,
the existing databases for climatological and stream-flow data have the following drawbacks:

- They need to be installed on computers running proprietary software,
   which means that they are not platform independent thus hindering their
   access
- The output of these databases has to be processed in order to be analyzed
   as it contains text (e.g. NA or sentences) within the data.
- The data stored on these databases comprise only a fraction of the re quired input in any type of hydrogeological study.

#### 150 4 The Basin of Mexico Hydrogeological Database (BMHDB)

As previously explained, hydrogeological information is spread throughout different agencies in the Basin of Mexico. In order to improve Water Management in the Basin it is first suggested to improve data management through a central database system which provides remote access in order to facilitate its updating and maintenance. The development of the Basin of Mexico Hydrogeological Database (BMHDB) comprised three main procedures as illustrated in Fig. 2 and which consisted of:



Fig. 2. Development of the Basin of Mexico Hydrogeological Database and interaction of its different components

(1) Data transcription: This stage consisted of transcribing the data ac quired as hard-copy reports such as location of wells, lithology records
 and groundwater table elevations.

(2) Data processing: Data from the existing databases or data provided
 in spread sheet formats were extracted and reformatted in a format
 usable by PostgreSQL. Spatial properties were reformatted according
 to the requirements of PostGIS.

(3) Map processing: Hard-copy maps (e.g. geology, land cover and edaphol ogy) had to be digitized and georeferenced before being processed. The
 processed maps are stored as both vector and raster maps in the GRASS
 database.

#### <sup>169</sup> 4.1 Data description

The structure of the BMHDB currently comprises thirteen different tables as illustrated in Figure 3 which can be divided in three subdatabases: climatological records, well records and run-off data. Some tables are organized by the agency which has the data (e.g. CNA or DGCOH) in order to facilitate the task of updating the database as it avoids duplication. The relevant fields of each table are shown in Fig. 3 and explained in Tables A.1, A.2 and A.3. As the BMHDB is a relational database, all tables are related by the id field of



Fig. 3. Structure of the Basin of Mexico Hydrogeological Database

each well (Fig.3(a)), climatological station (Fig 3(b)) or gauging station (Fig. 3(c)).

<sup>179</sup> The BMHDB comprises data at the Basin scale; this was accomplished by

gathering data from different governmental agencies, as illustrated by Fig. 180 4 which shows the areal coverage of the BMHDB well related data and the 181 agency which holds relevant data for each well; it should be stressed that 182 no attempt has been done to date in order to integrate all these data. As 183 illustrated in Fig. 3 different tables are related to each other, and all data 184 have a spatial reference stored in the coords field (Tables A.1, A.2 and A.3), 185 which avoids confusion when dealing with different coordinate systems. 186 This new database also integrates climatological and hydrometric informa-187 tion which were retrieved from BANDAS and ERIC (Fig. 5), improving the 188 way in which this information can be retrieved and visualized. The BMHDB 189 also comprises spatially variable information in both vector and raster for-190 mat which can be used in distributed hydrogeological modeling such as to 191 analyze the impact of urban growth on aquifer recharge. The development 192 of such analysis requires land cover map for different years, as illustrated 193 in Fig. (6) which shows such a map for both 1978 and 1985, the spatial dis-194 tribution of geological and soil units in the Basin, as illustrated in Fig. 7 195 and the spatial distribution of rainfall using its correlation with topography, 196 as done by Carrera-Hernández and Gaskin (2007b) who used local Kriging 197 with External Drift to develop rainfall maps and Kriging with External Drift 198 for both minimum and maximum temperature in the study area. 199

When developing the BMHDB, some data were missing from the original 200 sources such as the elevation of each well; to complete the wellsdgcoh or 201 wellscna tables with the elev field, the DEM was queried for those wells 202 which did not have this information as explained in a later section. In addi-203 tion, in order to ease monthly and annual statistical analyses, tables monthly 204 and annual were developed from daily data by using only those stations 205 with complete records. It is worth mentioning that data stored in the BMHDB 206 comprises officially registered wells; however, non registered wells exist 207 throughout the Basin. This adds another uncertainty factor to be considered 208 when groundwater flow modeling is undertaken; however, their impact 209 may be negligible, as the largest drawdown rates in the Basin are caused 210 by wells used for municipal water supply (Carrera-Hernández and Gaskin, 211 2007a). 212

Table 1 Data stored in the GIS database as raster and vector maps

Data		Scale	Туре		Source
Land Cove	er	1:250 000	Paper map		INEGI F14-11 (Pachuca)
		1:250 000	Paper map	,	INEGI E14-2 (Mexico City)
Topograph	ıy	1:250 000	Digital I tion Mode	Eleva- l	Shuttle Radar Topography Mission
Surface ogy	Geol-	1:100 000	Paper map	>	Mooser et al. (1996)
Edaphology		1:250 000	Paper map	,	INEGI F14-11 (Pachuca)
		1:250 000	Paper map	>	INEGI E14-2 (Mexico City)



Fig. 4. Well related data available in the Basin of Mexico Hydrogeological Database:(a) Spatial coverage of well data, color coded according to the agency from which data were gathered,(b) evolution of the groundwater table elevation for five wells located in the *Tizayuca* region. The wells are shown on a false color composite derived from LANDSAT-ETM+ imagery for March, 2000.



Fig. 5. Surface water related data: (a) Spatial distribution of climatological and hydrometric stations, (b) daily river flow volume and (c) daily climatological data. Coordinates are in UTM, zone 14.



Fig. 6. Land Cover map for the Basin of Mexico for two different years: (a) 1978 and (b) 1985. Coordinates are in UTM zone 14



Fig. 7. Spatial data stored in the GRASS database as raster maps, originally available as hard copy maps: (a) Surface geology adapted from Mooser et al. (1996) and (b) Soil units in the Basin.



Fig. 8. Structure of the municipal-socioeconomic database

213 4.2 Socioeconomic data

Sustainable water management also comprises both social and economic 214 aspects, therefore the database can also be extended to include these types 215 of data. Socioeconomic data are available on a municipal basis, thus a sub-216 database with a main table called *municipalities* (which is comprised of poly-217 gon data) can be linked to the tables described in the previous section through 218 the *munid* field. The data currently stored in the municipal database is shown 219 in Fig. 8, which can be used when analyzing water demand. For the sake of 220 brevity, a detailed description of each field is omitted. 221

#### 222 **5** Querying the database

The BMHDB can be queried by using SQL statements for which knowledge 223 of the database structure is required (Fig. 3 and Tables A.1, A.2 and A.3). 224 The information provided in this section aims to illustrating how the database 225 can be queried and by no means aims to provide a review of SQL statements; 226 interested readers are encouraged to read the postgreSQL and postGIS doc-227 umentation in order to undertake more complex queries. Generally speak-228 ing, the procedure to analyze the data stored in the database can be sum-229 marized in three steps: 1) the database must be queried and a new table is 230 written with the data of interest (this can be done either within GRASS, R or 231 the psql command line) using SQL statements, 2) the new table is used as 232 input for the interpolation procedure and 3) the resulting map is saved as a 233 raster file. An example is developed in the next section in order to illustrate 234

<sup>235</sup> the procedure.

In order to build the BMHDB, data stored in it was queried to obtain the 236 elevation of wells or hydrometric stations. Borehole information compiled 23 from the different water agencies in charge of water supply in the Basin 238 comprised data on depth to the water table while each geologic stratum 239 had an associated depth and not its elevation which is required in order to 240 characterize the aquifer. To obtain the elevation of each borehole the DEM 241 was queried using each borehole's coordinates in order to get their eleva-242 tion which was stored as a table with two fields: id and elevation. The 243 elevation column was added to the well's main table as column elevation 244 (Fig. 3(a) and Table A.1). A new table was created in order to account for 245 the elevation of each stratum by using the following SQL command: 246

```
247 BMHDB=# CREATE TABLE lithodgcoh AS SELECT l.id, l.top
248 (d.elev-l.top) AS topelev, l.thick, l.material, l.matid
249 FROM lithology AS l, dgcoh AS d
250 WHERE l.id=d.id;
```

The above command creates a table named lithodgcoh with fields id, top, topelev, thick, material and matid. The field topelev is computed by subtracting the top depth of each stratum to the DEM elevation at the corresponding well (accomplished by the WHERE condition of the SQL statement).

# 255 5.1 Spatial queries

The BMHDB is a spatial database which means that data have spatial attributes such as coordinates (e.g. x-y, lat-lon), spatial reference (e.g. UTM zone) and datum (e.g. NAD–27). This information is stored as geometry by postGIS and allows queries involving spatial information. In order to include the munid field in the dgcoh table, the following spatial query was used:

262 BMHDB=# SELECT w.id, m.id
263 FROM pai as w, municipalities as m
264 WHERE w.coords && m.coords

```
AND contains (m.coords,w.coords) and m.id<30000
ORDER by w.id;
```

This query selects the well and municipality id fields for those wells located inside a municipality whose id is less than 30000 and evidently, other spatial queries can be done. Let us assume that a user wants to analyze the lithology records of those wells located in the Quaternary lacustrine deposits (Qla; Fig. 7(a)); this is accomplished by using the postGIS function contains, the surface geology vector map and the well database as follows:

```
273 BMHDB=# SELECT w.id FROM dgcoh as w, geology as g
274 WHERE w.coords && g.coords
275 AND contains (g.coords,w.coords) AND g.cat=1
276 ORDER by w.id;
```

Through the previous SQL command, those wells that are enclosed by polygons of category 1 (where category 1 = Qal) from table dgcoh are selected.
The output is ordered by the well's field id. In this manner only those wells
located inside one or more polygons can be found.

#### <sup>281</sup> 6 Interaction with other open source software

The reason why the BMHDB was developed was to provide readily acces-282 sible data for hydrogeological studies, which can be done by using different 283 open source software, such as the R statistical software (R Development Core Team, 284 2005), which provides tools for classical statistical tests, time series analy-285 sis and spatial interpolation, as different libraries can be used to under-286 take these tasks. One of these libraries is the GSTAT library (Pebesma, 2004) 287 which can be used for spatial interpolation through different Kriging meth-288 ods (i.e. Ordinary, Universal or local Kriging). Once the spatial distribu-289 tion of a variable is obtained (i.e. temperature or rainfall), it can be stored 290 as a GRASS raster map through the use of R's grass library (Bivand, 2000). 291 This approach was used by Carrera-Hernández and Gaskin (2007b) to un-292 dertake a daily analysis of rainfall and both minimum and maximum tem-293 perature in the study area using a raster map (DEM) and time series data of 294 these three climatological variables. The importance of the approach taken 295

to develop the BMHDM is also illustrated by Carrera-Hernández and Gaskin
(2007a) to undertake the first Basin-wide analysis of the evolution of the potentiometric level in the study area using satellite imagery along with time
series data of pumping rates and groundwater table elevation. In order to
show how these analyses can be undertaken, the current section provides
simple examples on how data stored on the BMHDB can be readily accessed
and analyzed using annual rainfall for 1979.

#### 303 6.1 Geostatistical analysis of data

The methodology described is exemplified by (1) analyzing the correlation 304 between annual accumulated rainfall and elevation for years 1972–1985 by 305 developing a scattergram showing the correlation value between these two 306 variables and (2) by developing a spatial map of accumulated rainfall for 307 the Basin of Mexico in 1979 through the use of Kriging with External Drift 308 (KED), with elevation as a secondary variable. Although different GUIs are 309 available for R, its main advantage is that it can be used from the command 310 line, providing flexibility and the capability of using scripts and accessing it 311 in batch mode, allowing to undertake large amounts of statistical analysis. 312 The commands required to access the database and analyze the correlation 313 for the previously mentioned period are shown on Fig. 9 for which a brief 314 description is given in order to illustrate the capabilities of the BMHDB. The 315 goal is not to develop a brief tutorial and interested users are referred to the 316 R project web page /www.r-project.org, which provides a listing of all the 317 available packages and their documentation. 318

In order to be able to read and write to the GRASS database, R needs to be 319 called from within GRASS from the command line, after which the required 320 libraries must be loaded (Fig 9, line 1): spgrass6 is used to write/read data 321 from GRASS, RPgSQL is used to access postgreSQL and GSTAT is used for 322 the spatial interpolation. In addition, R automatically loads other libraries 323 such as grid and lattice which were used to plot the different correlation 324 values for 1972–1983 in Fig. 10. Once the libraries have been loaded, the 325 database is accessed from R (Fig. 9, line 2) which in this case is being ac-326 cessed on a local computer and so both the host and port options are set 327

```
1
        library(RPgSQL)
2
        db.connect(host=NULL,port=NULL,dbname='BMHDB')
3
        db.execute("SELECTua.id,a.year,a.rain,w.elevation
           ,w.east,w.northuFROMuannualuasua,uweatheruasuw
          ⊔WHERE⊔a.year>=1972⊔AND⊔a.year<=1983⊔AND⊔a.id=
          w.id\_AND\_w.elevation\_is\_not\_null\_AND\_a.rain\_is
          ⊔not⊔null",clear=F)
4
        id<-db.read.column("id",as.is=F)</pre>
5
        rain<-db.read.column("rain",as.is=F)</pre>
6
        year <-db.read.column("year",as.is=F)</pre>
7
        s1<-db.read.column("east",as.is=F)</pre>
8
        s2<-db.read.column("north",as.is=F)</pre>
9
        dem200 <- db.read.column("elevation",as.is=F)</pre>
        annualrain <- data.frame(id,year,east,north,dem200,</pre>
10
           rain)
11
        xyplot(rain~dem200|year,data=annualrain,ylab="
           accumulated_{\Box}rainfall_{\Box}(mm)", xlab="elevation_{\Box}(
          masl)",panel = function(x,y){panel.xyplot(x,y,
          pch="+")+panel.abline(lm(y~x));grid.text(round
           (cor(x,y),2),x=unit(1,"mm"),y=unit(1,"npc")-
           unit(1,"mm"),just=c("left","top"))},layout=c
           (4,3), ylim=0:2000)
```

Fig. 9. Analysis of annual accumulated rainfall in the Basin of Mexico using the R statistical language.

to null values. The database is queried using standard SQL commands (Fig.
9, line 3) and a dataframe is created in order to ease the statistical analysis
which can be done with R (Fig. 9, lines 4–10). The scattergram plot showing
both the correlation line and value (Fig. 10) were computed with line 11 of
Fig. 9.

As previously mentioned, Kriging with External Drift is used in order to 333 develop the spatial pattern of rainfall for 1979 which was chosen as it is 334 the year that exhibits the largest correlation value between rainfall and el-335 evation (Fig. 10). The spatial interpolation is undertaken through the com-336 mands shown in Fig. 11 in which lines 1-3 are used to load the required 337 libraries. The Digital Elevation Model (Fig. 1), which is stored in GRASS is 338 used as an auxiliary variable in the use of KED and is read in line 4. Using 339 the annual data retrieved in the previous step (Fig. 10), a new dataframe 340 for the selected year is created to facilitate the example (Fig. 11, line 8). A 341



Fig. 10. Correlation between annual accumulated rainfall and elevation for years 1972–1983.

<sup>342</sup> semivariogram is computed, visualized and used to undertake the spatial

interpolation (Fig. 11, lines 9–14) and plotted using R's sp library (Fig. 11,

lines 15–17) as shown in Fig. 12. The interpolated surface can be written to
the GRASS database (Fig. 11, line 18) in order to be used in further studies

<sup>346</sup> such as a spatially distributed water balance.

# 347 7 Discussion

New tools are required to improve water management at the Basin level 348 and to achieve a participatory approach. The BMHDB provides both local 340 and remote access as it uses the RDBMS postgreSQL and can be queried with 350 or without the use of a GIS as shown in this work. In addition, the way 351 in which the database is structured avoids the need for data processing in 352 order to undertake statistical analysis. In order to undertake any analysis 353 on the data stored in the BMHDB its structure needs to be transparent to the 354 end users. 355

<sup>356</sup> The proposed database facilitates the task of compiling information as it can

```
1
        library(spgrass6)
2
        library(gstat)
3
        library(RColorBrewer)
        elevation <-readCELL6sp("dem200")</pre>
4
5
        ccacoords <- coordinates (elevation)</pre>
6
        dem200 <- elevation $dem200
7
        ccagrid <-data.frame(ccacoords,dem200)</pre>
8
        rain79<-data.frame(annualrain[annualrain$year
           ==1979,])
9
        vgm79 <- variogram (rain ~ dem200 , ~ s1+s2 , rain79 , cutoff</pre>
           =40000)
        sil <-max(vgm79$gamma)</pre>
10
11
        nug<-min(vgm79$gamma)</pre>
12
        vgmfit79 <- fit.variogram(vgm79,vgm(nug,"Exp"</pre>
           ,15000,sil))
13
        plot(vgm79,main="1979",model=vgmfit79)
        rainked79 <-krige(rain~dem200,locations=~s1+s2,</pre>
14
           data=rain79,model=vgmfit79,newdata=ccagrid)
15
        coordinates (rainked79) = s1+s2
16
        gridded(rainked79)=TRUE
17
        spplot(rainked79["var1.pred"], sp.layout=list("sp.
           points", stations, pch=19, cex=0.45, col="black"),
           pretty=TRUE,cuts=9,col.regions=brewer.pal(9,"
           Blues"),xlab="EASTING", ylab="NORTHING",scales
           =list(draw=TRUE))
18
        writeRast6(rainked79,"kedrain79")
```

Fig. 11. Geostatistical analysis of annual rainfall in the Basin of Mexico for 1979 using elevation as a secondary variable.

<sup>357</sup> be easily updated and accessed due to the RDBMS client-server capabilities.
<sup>358</sup> Some information such as the wells' coordinates was verified with existing
<sup>359</sup> maps when available or by locating them in a map and checking if their
<sup>360</sup> location corresponded to that stored in the database.

The BMHDB provides data in spatial format thus allowing queries of spatial nature such as distance or polygon inclusion. Furthermore, the database can be processed with GRASS' raster and vector modules which allows the development of new maps by using map algebra for raster maps or unions and intersections for vector data. These modules can be used when developing groundwater flow models to calculate, for example, the width and length of a river reach within a finite difference model cell. Another advan-



Fig. 12. Spatial distribution of rainfall for 1979; black dots represent the climatological stations used to undertake the interpolation. Coordinates are in km, UTM–14.

tage of the BMHDB is that its data can be used "as-is" to develop groundwa-

ter flow models through the use of the r.gmtg tool (Carrera-Hernández and Gaskin,

<sup>370</sup> 2006) which links the finite difference groundwater flow model MODFLOW

<sup>371</sup> with the GRASS GIS.

The development of the BMHDB represents a step towards Integrated Water 372 Management in the Basin, as its data can be used to analyze the relationship 373 between land cover change and groundwater; in addition, it also provides 374 a framework to analyze water demand, as socioeconomic data can be also 375 added to the database as shown in Fig. 8. Improving water management 376 involves proper data management, a task that can be achieved using the 377 framework presented in this paper as: (1) all tools used in the development 378 of the BMHDB are open-source software, which can be downloaded from 379 the Internet (grass.itc.it, www.r-project.org, www.postgresql.org and 380 postgis.refractions.net) and (2) these tools are cross platform, meaning 381 that they can be used on different operating systems without restrictions. 382 Data stored in the BMHDB can be accessed only by authorized users. 383

The importance of developing a reliable database for hydrological mod-384 elling has triggered the development of similar, larger and well funded 385 projects such as the Consortium of Universities for the Advancement of Hy-386 drologic Science (CUAHSI) Hydrologic Information System. The framework 387 used to develop the BMHDB can be extended to a national level in Mex-388 ico, in order to integrate different databases required to develop complex 389 distributed numerical models. Evidently, the database would be greatly im-390 proved by integrating real time data, for which the participation of Mexico's 391 water supply agency is required. 392

#### 393 8 Conclusions

The Basin of Mexico Hydrogeological Database has been developed as a first step towards achieving an Integrated Water Resources Management approach in the Basin of Mexico as it provides spatial data on soils, land cover, geology and climatological variables which can be used in regional hydrogeological studies without further processing. As exemplified in this work, the BMHDB can be accessed and analyzed with the use of open source software, freely available from the Internet and completely cross-platform.

The GIS visualization capabilities provide a means to verify the spatial lo-401 cation of point data and to communicate the result of future water manage-402 ment decisions obtained through modeling; however, a GIS is not required 403 to analyze and visualize the data stored in the RDBMS as exemplified in 404 this work. Although this database was developed for the Basin of Mex-405 ico, this work provides a general framework on the development of spatial 406 databases for hydrogeological modeling applicable to any watershed. The 407 way in which the BMHDB is structured facilitates its application in both the 408 development and calibration of distributed hydrological and groundwater 400 models. The structure of the database allows it to be easily maintained and 410 kept up to date allowing the inclusion of additional data as they become 411 available. 412

# 413 **References**

- <sup>414</sup> Birkle, P., Torres-Rodriguez, V., and González-Partida, E. (1998). The water
  <sup>415</sup> balance for the Basin of the Valley of Mexico and implications for future
  <sup>416</sup> water consumption. *Hydrogeology Journal*, 6:500–517.
- <sup>417</sup> Bivand, R. S. (2000). Using the R statistical data analysis language on <sup>418</sup> GRASS 5.0 GIS database files. *Computers & Geosciences*, 26:1043–1052.
- <sup>419</sup> Carrera-Hernández, J. J. and Gaskin, S. J. (2006). The Groundwater Model <sup>420</sup> ing Tool for GRASS (GMTG): Open Source Groundwater Flow Modeling.
   <sup>421</sup> Computers & Geosciences, 32:339–351.
- 422 Carrera-Hernández, J. J. and Gaskin, S. J. (2007a). The Basin of Mexico
- <sup>423</sup> aquifer system: regional groundwater level dynamics and database de-<sup>424</sup> velopment. *Hydrogeology Journal*, 15(8):1577–1590. DOI: 10.1007/s10040-
- 425 007-0194-9.
- Carrera-Hernández, J. J. and Gaskin, S. J. (2007b). Spatio temporal analysis
   of daily precipitation and temperature in the Basin of Mexico. *Journal of Hydrology*, 336(3–4):231–249. DOI: 10.1016/j.jhydrol.2006.12.021.
- <sup>429</sup> CNA (2002). Registro público de derechos de uso de agua (public register
   <sup>430</sup> of water rights). GRAVAMEX, internal data.
- <sup>431</sup> CNA (2003). Lithology records from wells operated by cna. Several files,
   <sup>432</sup> internal data.
- <sup>433</sup> DGCOH (1994). Diágnostico del estado presente de las aguas subterráneas
   <sup>434</sup> de la ciudad de méxico y determinación de sus condiciones futuras (di-
- agnosis of the present state of groundwater in mexico city and its future
  condition). Technical report, Instituto de Geofísica, UNAM.
- <sup>437</sup> DGCOH (1996). Actualización de parámetros hidrogeológicos y elaboración de pruebas de bombeo. Technical report, Consultores en Geología.
  <sup>439</sup> DGCOH (1997). Digitalización en ambiente cad y captura de datos para integrar la base de información de pozos a cargo de la dgcoh. Technical
- report, ORVI impulsora de Ingeniería.
- DGCOH (1999). Estudio para actualizar la base de datos de la modelación del acuífero y simulación mediante modelos matemáticos aplicando diferentes políticas de explotación en el distrito federal. Technical
  report, DITAPSA Consultores, S.A. de C.V.
- <sup>446</sup> DGCOH (2000). Piezometría del valle de méxico. Technical report, Lesser
  <sup>447</sup> y Asociados S.A. de C.V.
- DGCOH (2002). Estudio geológico de la zona poniente del valle de méxico
  e interpretación estratigráfica de los pozos de agua a cargo de la dgcoh
  localizados en las delegciones de azcapotzalco, miguel hidalgo, álvaro
  obregón, magdalena contreras y cuajimalpa, méxico, d.f. Technical report, Ing. Luis Chavelas-Peña.
- <sup>453</sup> Edmunds, W. M., Carrillo-Rivera, J. J., and Cardona, A. (2002). Geochemical <sup>454</sup> evolution of groundwater beneath mexico city. *J. of Hydrology*, 254:1–24.
- 455 Huizar-Álvarez, R. (1993). Simulacion matemática del sistema acuífero
- de chalco-amecameca, méxico (mathematical modelling of the chalco-

amecameca aquifer system). *Geofísica Internacional*, 32(1):57–79. 457 ICWE (1992). International conference of water and environment. 458 www.wmo.ch/web/homs/documents/english/icwedece.html. Ac-459 cessed on August, 2005. 460 IMTA (1990). Extractor Rápido de Información Climatológica (Fast Extractor of 461 *Climatological Information) (ERIC).* Instituto Mexicano de Tecnología del 462 Agua. 463 IMTA (1995). Banco Nacional de Datos de Aguas Superficiales (National data of 464 Surface waters) (BANDAS). Instituto Mexicano de Tecnología del Agua. 465 Mooser, R., Montiel, A., and Zúñiga, A. (1996). Nuevo mapa geológico de las 466 cuencas de México, Toluca y Puebla. Estratigrafía tectónica regional y aspectos 467 geotérmicos (new gelogical map for the Basins of Mexico, Toluca and Puebla). 468 Comisión Federal de Electricidad. 469 NRC (1995). Mexico City's Water Supply: Improving the Outlook for sustainabil-470 ity. National Academy of Sciences. 471 Ortega, A. and Farvolden, R. N. (1989). Computer analysis of regional 472 groundwater flow and boundary conditions in the basin of mexico. J. 473 of Hydrology, 110:271–294. 474 Pebesma, E. J. (2004). Multivariable geostatistics in S: the gstat package. 475 *Computers & Geosciences*, 30:683–691. 476 R Development Core Team (2005). R: A language and environment for statis-477 tical computing. R Foundation for Statistical Computing, Vienna, Austria. 478 ISBN 3-900051-07-0. 479 UNCED (1992). confer-United nations 480 and development. environment 481 ence on www.un.org/esa/sustdev/documents/agenda21/english/agenda21toc.htm. 482 Accessed on August, 2005. 483

# **484 A Description of tables**

Table	Field	Data Type	Description	Source
cna and dgcoh	id	varchar	Borehole ID (prefix cna or dgcoh)	CNA (2003),DGCOH (2000),DGCOH (2002), this paper

Table A.1: Description of the fields of the BMHDB borehole subdatabase

Table	Field	Data Type	Description	Source
	east	long int	Easting of well	
	north	long int	Northing of well	
	munid	int	Municipality on which the well is located	
	owner	char	Owner of well	
	elevation	float	Well top elevation (masl)	
	coords	geometry	coordinates and ele- vation of climatologi- cal station with Spatial Reference ID number for UTM-14	
depth	id	varchar	Borehole ID	DGCOH (2000), CNA (2003)
	date	timestamp	acquisition date	
	depth	float	depth to groundwater table	
metals	id	varchar	Borehole ID	DGCOH (1994), Huizar-Álvarez (1993),Edmunds et al. (2002)
	fe	float	Iron (mg/L)	
	mn	float	Manganese (mg/L)	
	b	float	Boron (mg/L)	
	cu	float	Copper (mg/L)	
	со	float	Cobalt (mg/L)	
	cr	float	Chromium (mg/L)	

Table A.1: Description of the fields of the BMHDB borehole subdatabase

Table	Field	Data Type	Description	Source
	zn	float	Zinc (mg/L)	
	pb	float	Lead (mg/L)	
	cd	float	Cadmium (mg/L)	
	ni	float	Niquel (mg/L)	
chem	id	varchar	Borehole ID	Same as above
	date	timestamp	Acquisition date	
	temp	float	Temperature (°C)	
	ec	float	Electric Conductivity $(\mu\Omega/cm)$	
	ph	float	Phosphorous (mg/L)	
	ca2	float	Calcium (mg/L)	
	mn2	float	Manganese (mg/L)	
	na	float	Sodium (mg/L)	
	k	float	Potassium (mg/L)	
	HCO3	float	Bicarbonate (mg/L)	
	cl	float	Chlorine (mg/L)	
	so4	float	Sulphate (mg/L)	
	no3	float	Nitrate (mg/L)	
	tds	float	Total Dissolved Solids (mg/L)	
lithology	id	varchar	Borehole ID	DGCOH (2002),DGCOH (1997),DGCOH (1996), CNA (2003)
	top	int	top depth of stratum	

Table A.1: Description of the fields of the BMHDB borehole subdatabase

Table	Field	Data Type	Description	Source
	topelev	int	top elevation of stra- tum	
	thick	int	stratum thickness	
	material	varchar	material's letter code	
	matid	int	material's id number	
prates	id	varchar	Borehole ID	CNA (2002),DGCOH (1999)
	year	int	year	
	month	int	month	
	prate	float	pumping rate	
ptests	id	varchar	well id	DGCOH (1996)
	date	timestamp	acquisition date	
	prate	float	extraction rate (m <sup>3</sup> /s)	
	ddown	float	observed drawdown (m)	
	recov	float	observed recovery (m)	
screen	id	varchar	well id	DGCOH (1997),DGCOH (1996)
	top	float	top elevation of screen	
	length	float	screen length	

Table A.1: Description of the fields of the BMHDB borehole subdatabase

Table	Field	Data Type	Description	Source
weather	id	int	station id number	IMTA (1990)
	east	longint	easting of climatolog- ical station (meters, UTM-14)	
	north	longint	northing of climato- logical station (meters, UTM-14)	
	name	varchar	name of climatological station	
	munid	int	id of municipality on which the station is lo- cated	
	elevation	int	elevation of climato- logical station (masl)	
	coords	geometry	coordinates and ele- vation of climatologi- cal station with Spatial Reference ID number for UTM-14.	
daily	id	int	station id number	IMTA (1990)
	date	timestamp	date of measurement	
	rain	float	daily rainfall (mm)	
	tmin	float	daily minimum tem- perature (°C)	
	tmax	float	daily maximum tem- perature (°C)	
	tavg	float	daily average tempera- ture (°C)	
	evap	float	daily pan evaporation (mm)	

Table A.2: Structure of the fields of the BMHDB weather subdatabase.

Table	Field	Data Type	Description	Source
monthly	id	int	station id number	This paper
	year	int	year of measurement	
	month	int	month of measurement	
	rain	float	monthly rainfall (mm)	
	tavg	float	monthly average tem- perature (°C)	
	evap	float	monthly pan evapora- tion (mm)	
annual	id	int	station id number	This paper
	year	int	year of measurement	
	rain	float	annual rainfall (mm)	
	temp	float	annual temperature (°C)	
	evap	float	annual pan evapora- tion (mm)	

Table A.2: Structure of the fields of the BMHDB weather subdatabase.

Table A.3: Structure of the fields of the BMHDB run-off subdatabase

Table	Field	Data Type	Description	Source
runoff	id	int	hydrometric station id number	IMTA (1995)
	east	longint	easting of station (UTM-14)	
	north	longint	northing of station (UTM	

Table	Field	Data Type	Description	Source
	coords	geometry	coordinates and ele- vation of climatologi- cal station with Spatial Reference ID number for UTM-14	
	name	string	station name	
	stream	string	stream on which the station is located	
	basin	string	basin on which the sta- tion is located	
	munid	int	id of municipality on which the station is lo- cated	
hourly	id	int	hydrometric station id number	IMTA (1995)
	date	timestamp	date and time of acqui- sition date	
	flow	float	flow measurement (10 <sup>3</sup> m <sup>3</sup> )	
daily	id	int	hydrometric station id number	IMTA (1995)
	date	timestamp	acquisition date	
	qmin	float	daily minimum flow (m <sup>3</sup> /s)	
	qmax	float	daily maximum flow (m <sup>3</sup> /s)	
	qavg	float	daily average flow (m <sup>3</sup> /s)	
	vol	float	daily volume (10 <sup>3</sup> m <sup>3</sup> )	

Table A.3: Structure of the fields of the BMHDB run-off subdatabase

Table	Field	Data Type	Description	Source
monthly	id	int	hydrometric station id number	IMTA (1995)
	year	int	year of flow	
	month	int	month	
	qmin	float	monthly minimum flow (m <sup>3</sup> /s)	
	qmax	float	monthly maximum flow (m <sup>3</sup> /s)	
	qavg	float	monthly average flow (m <sup>3</sup> /s)	
	vol	float	monthly volume $(10^3 \text{ m}^3)$	
annual	id	int	hydrometric station id number	IMTA (1995)
	year	int	year of flow	
	qmin	float	annual minimum flow (m <sup>3</sup> /s)	
	qmax	float	annual maximum flow (m <sup>3</sup> /s)	
	qavg	float	annual average flow (m <sup>3</sup> /s)	
	vol	float	annual volume (10 <sup>3</sup> m <sup>3</sup> )	

Table A.3: Structure of the fields of the BMHDB run-off subdatabase