

January 2004

Personal Data Warehouse Application (Coursework Report)

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SB02G - Data Mining and Data Warehousing

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Semester A

MSc Software Engineering

2003-2004



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1. PROPOSAL

This Personal Data Warehouse Application (PDWA) is based on the Private Practice Management System for doctor/medical personnel. The objective of this application is to provide solution for a Doctor to manage his/her private practice and to administer the patient and practice data effortlessly. The main components of the application are Patient record management, Practice details, Treatment records according to categories, Hospitals or procedure/practice sites and Payment system.

Typical relational database can be used to perform normal day-to-day operations at a private doctor surgery. Every new patient record will be maintained and can be used for future diagnostics and analysis. An invoice will be issued against each treatment performed on specific patient at any specific time. The record of payments received from the patient will be maintained in a separate table.

To implement this application in a data warehouse scenario, following measures can be taken:

- Charges for a patients from different area getting treatments for a certain period of time
- Identify the treatments mostly performed for treating patients of different area and ages

In this PDWA, I am using the sample data for radiology treatments. The information gathered in building this PDWA is provided by a Consultant Radiologist currently working in a hospital and who also provides private health services.

The PDWA will be implemented using Microsoft SQL Server 2000 Database system which also supports OLAP, Data warehousing and Data mining techniques. The sample data for the patients is generated using the actual data due to confidentiality of the personal data. Any resemblance with any person will be accidental and coincidental.

2. SCHEMA FOR PDWA

For creating a data warehouse, first we have to build a relational database. Based on that database, we can create dimensions and fact table for the data warehouse. Those dimensions and fact table will be used in the Star Schema for demonstrating the data warehouse.

2.1 What is a Star Schema?

It is a relational database schema for representing multidimensional data. The data is stored in a central fact table, with one or more tables holding information on each dimension. Dimensions have levels, and all levels are usually shown as columns in each dimension table ^[NP03].

2.2 Entity Relationship Diagram (ERD)

The scenario selected for the PDWA will contain following entities:

- Patients
- Practice
- Treatments
- Hospitals
- Payments

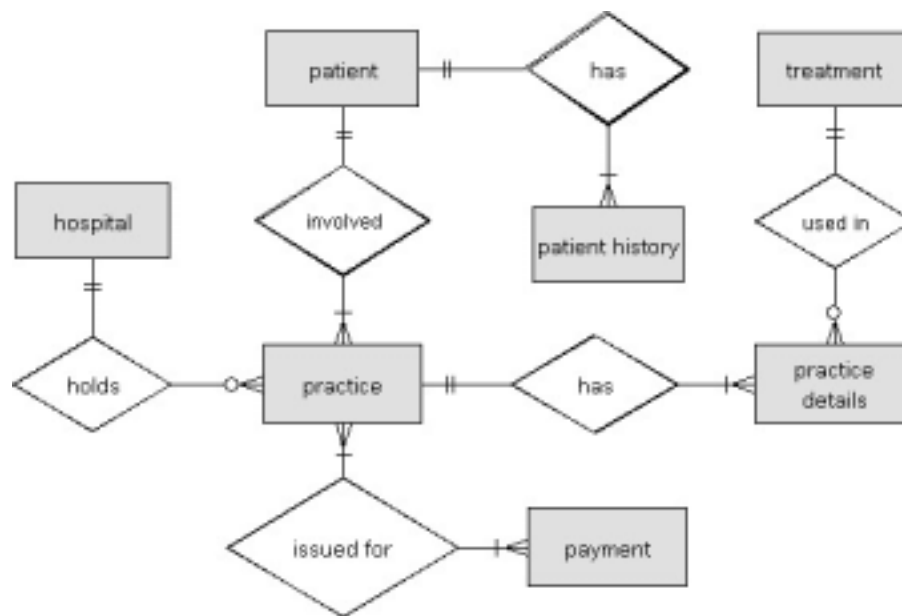


Fig 01: ERD for PDWA with cardinality and relationships

This ERD represents the entities and their relationship with each other. However, when we start designing of the physical database design, it is possible to further expand the entities represented in the above ERD.

For example, we can divide practice into 2 table i.e. `practice` and `practice_details` and `patient` table has `patientHistory`.

2.2.1 Detailed ERD with Primary, Foreign Keys

Following ERD shows entities with their attributes including primary and foreign keys.

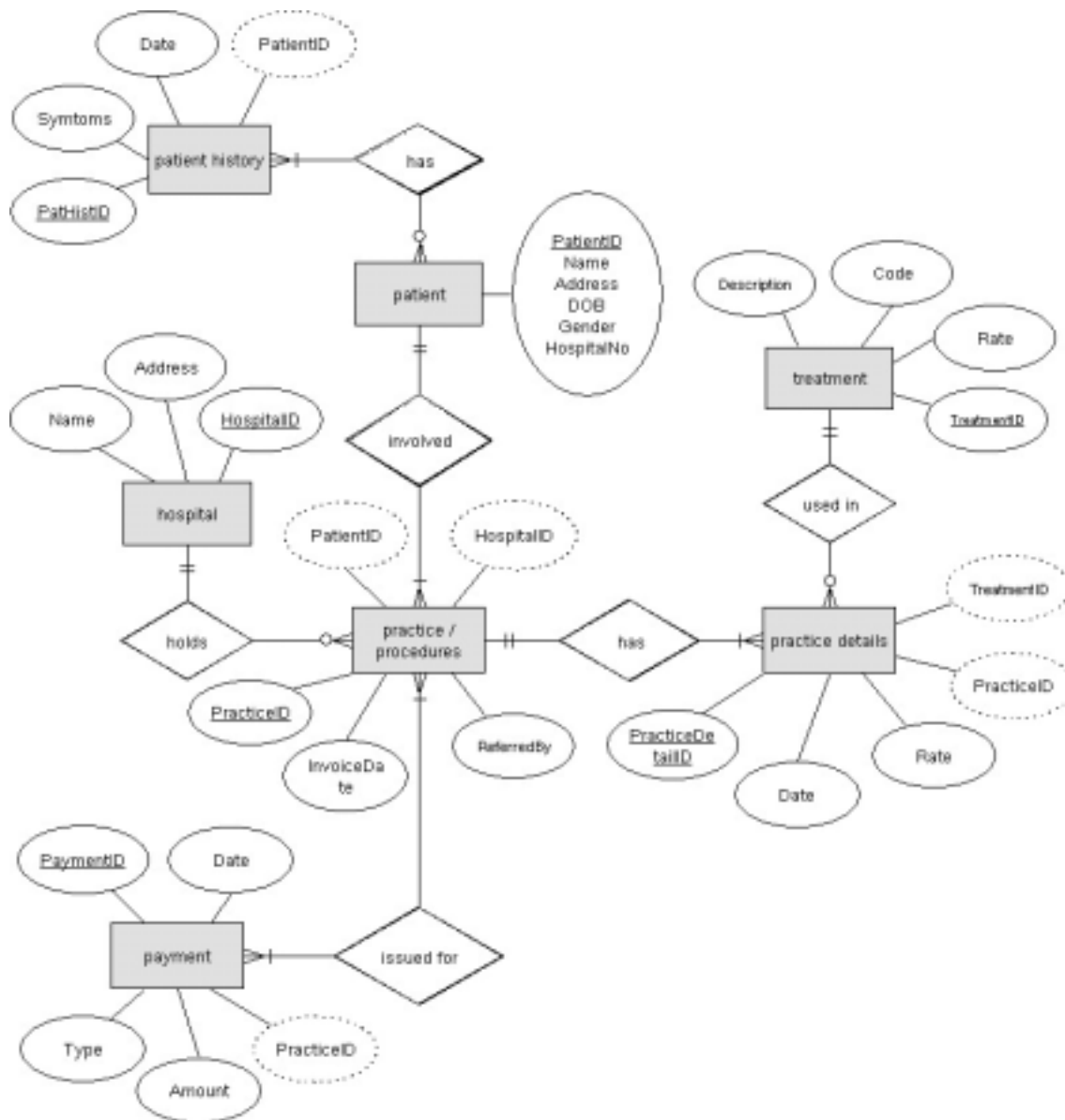


Fig 02: ERD with attributes, primary and foreign keys

2.3 Creating Database

Following command will create a relational database that will be used in the PDWA. The database name given for it is fahad. After that we will add tables to this database.

```
CREATE DATABASE [fahad]

ON (NAME = N'fahad_dat', FILENAME = N'C:\Program Files\Microsoft SQL
Server\MSSQL\data\fahad.mdf', SIZE = 2, FILEGROWTH = 10%)

LOG ON (NAME = N'fahad_log', FILENAME = N'C:\Program Files\Microsoft SQL
Server\MSSQL\data\fahad.ldf', SIZE = 2, FILEGROWTH = 10%)
```

2.4 Creating Tables

Following queries can be used in the creation of actual database tables and implementing constraints between them.

2.4.1 Hospitals Table

```
CREATE TABLE [dbo].[Hospitals] (
    [HospitalID] [int] IDENTITY (1, 1) NOT NULL,
    [HospitalName] [nvarchar] (50) NOT NULL,
    [Address] [nvarchar] (255) NOT NULL,
    [Town] [nvarchar] (50) NULL,
    [City] [nvarchar] (25) NULL,
    [Province] [nvarchar] (20) NULL,
    [PostCode] [nvarchar] (20) NULL,
    [PhoneNumber] [nvarchar] (15) NULL,
    [FaxNumber] [nvarchar] (15) NULL
) ON [PRIMARY]
```

2.4.2 Patients Table

```
CREATE TABLE [dbo].[Patients] (
    [PatientID] [int] IDENTITY (1, 1) NOT NULL,
    [FirstName] [nvarchar] (25) NOT NULL,
    [LastName] [nvarchar] (25) NOT NULL,
    [Address] [nvarchar] (255) NULL,
    [Town] [nvarchar] (50) NULL,
    [City] [nvarchar] (50) NULL,
    [Province] [nvarchar] (20) NULL,
    [PostCode] [nvarchar] (10) NULL,
    [Country] [nvarchar] (50) NULL,
    [Gender] [nvarchar] (8) NOT NULL,
    [Birthdate] [smalldatetime] NULL,
    [HospitalNo] [nvarchar] (25) NULL
) ON [PRIMARY]
```

2.4.3 Treatments Table

```
CREATE TABLE [dbo].[Treatments] (
```

```
[TreatmentID] [int] IDENTITY (1, 1) NOT NULL,  
[TreatmentDesc] [nvarchar] (250) NOT NULL,  
[TreatmentRate] [money] NULL  
[TreatmentType] [nvarchar] (50) NULL,  
) ON [PRIMARY]
```

2.4.4 fact_table Table

```
CREATE TABLE [dbo].[fact_table] (  
    [PracticeID] [nvarchar] (50) NULL,  
    [PracticeDetailID] [int] NULL,  
    [PatientID] [int] NULL,  
    [TreatmentID] [int] NULL,  
    [PracticeDate] [datetime] NULL,  
    [total_fees] [money] NULL,  
    [age] [char] (10) NULL,  
    [symptoms] [nvarchar] (50) NULL,  
    [area] [nvarchar] (50) NULL  
) ON [PRIMARY]
```

2.4.5 PatientHistory Table

```
CREATE TABLE [dbo].[PatientHistory] (  
    [Pat_HistID] [numeric](18, 0) IDENTITY (1, 1) NOT NULL,  
    [PatientID] [int] NOT NULL,  
    [PatSymtoms] [nvarchar] (100) NULL,  
    [PatCheckingDate] [datetime] NULL  
) ON [PRIMARY]
```

2.4.6 Practice Table

```
CREATE TABLE [dbo].[Practice] (  
    [PracticeID] [nvarchar] (50) NOT NULL,  
    [PatientID] [int] NOT NULL,  
    [HospitalID] [int] NULL,  
    [InvoiceDate] [datetime] NULL,  
    [AdditionalNotes] [nvarchar] (200) NULL  
) ON [PRIMARY]
```

2.4.7 Payments Table

```
CREATE TABLE [dbo].[Payments] (  
    [PaymentID] [int] IDENTITY (1, 1) NOT NULL,  
    [PracticeID] [nvarchar] (50) NOT NULL,  
    [PaymentAmount] [money] NOT NULL,  
    [PaymentDate] [smalldatetime] NULL,  
    [PaymentType] [nvarchar] (50) NULL,  
    [ChequeNumber] [nvarchar] (50) NULL  
) ON [PRIMARY]
```

2.4.8 PracticeDetails Table

```
CREATE TABLE [dbo].[PracticeDetails] (  

```



```

    [PracticeDetailID] [int] IDENTITY (1, 1) NOT NULL,
    [PracticeID] [nvarchar] (50) NOT NULL,
    [TreatmentID] [int] NULL,
    [Rate] [money] NULL,
    [PDate] [smalldatetime] NULL
) ON [PRIMARY]

```

2.4.9 times Table

```

CREATE TABLE [dbo].[times] (
    [timeID] [numeric](18, 0) IDENTITY (1, 1) NOT NULL,
    [the_date] [datetime] NULL,
    [the_day] [nvarchar] (50) NULL,
    [the_month] [nvarchar] (50) NULL,
    [the_year] [numeric](18, 0) NULL,
    [day_of_month] [numeric](18, 0) NULL,
    [week_of_year] [numeric](18, 0) NULL,
    [month_of_year] [numeric](18, 0) NULL,
    [quarter_of_year] [nvarchar] (50) NULL
) ON [PRIMARY]

```

2.5 Constraints and Relationships between tables

After creating tables, next step is to assign Primary and Foreign keys and creating links between them. This can be done by identifying foreign keys and enforcing integrity constraints between them, so that data reliability remains intact.

2.5.1 Assigning Primary Keys

Following commands can be used in implementing Primary keys.

```

ALTER TABLE [dbo].[Hospitals] WITH NOCHECK ADD
    CONSTRAINT [PK_Hospitals] PRIMARY KEY CLUSTERED
    (
        [HospitalID]
    ) ON [PRIMARY]

```

```

ALTER TABLE [dbo].[Patients] WITH NOCHECK ADD
    CONSTRAINT [PK_Patients] PRIMARY KEY CLUSTERED
    (
        [PatientID]
    ) ON [PRIMARY]

```

```

ALTER TABLE [dbo].[Treatments] WITH NOCHECK ADD
    CONSTRAINT [PK_Treatments] PRIMARY KEY CLUSTERED
    (
        [TreatmentID]
    ) ON [PRIMARY]

```

```

ALTER TABLE [dbo].[PatientHistory] WITH NOCHECK ADD
    CONSTRAINT [PK_PatientHistory] PRIMARY KEY CLUSTERED
    (
        [Pat_HistID]
    )

```

```
        ) ON [PRIMARY]

ALTER TABLE [dbo].[Practice] WITH NOCHECK ADD
    CONSTRAINT [PK_Practice] PRIMARY KEY CLUSTERED
    (
        [PracticeID]
    ) ON [PRIMARY]

ALTER TABLE [dbo].[Payments] WITH NOCHECK ADD
    CONSTRAINT [PK_Payments] PRIMARY KEY CLUSTERED
    (
        [PaymentID]
    ) ON [PRIMARY]

ALTER TABLE [dbo].[PracticeDetails] WITH NOCHECK ADD
    CONSTRAINT [PK_PracticeDetails] PRIMARY KEY CLUSTERED
    (
        [PracticeDetailID]
    ) ON [PRIMARY]
```

2.5.2 Assigning Foreign Keys and Constraints

Following commands can be used in implementing foreign keys, relationships and integrity constraints.

```
ALTER TABLE [dbo].[PatientHistory] ADD
    CONSTRAINT [FK_PatientHistory_Patients] FOREIGN KEY
    (
        [PatientID]
    ) REFERENCES [dbo].[Patients] (
        [PatientID]
    ) ON UPDATE CASCADE

ALTER TABLE [dbo].[Practice] ADD
    CONSTRAINT [FK_Practice_Hospitals] FOREIGN KEY
    (
        [HospitalID]
    ) REFERENCES [dbo].[Hospitals] (
        [HospitalID]
    ) ON UPDATE CASCADE,
    CONSTRAINT [FK_Practice_Patients] FOREIGN KEY
    (
        [PatientID]
    ) REFERENCES [dbo].[Patients] (
        [PatientID]
    ) ON DELETE CASCADE ON UPDATE CASCADE

ALTER TABLE [dbo].[Payments] ADD
    CONSTRAINT [FK_Payments_Practice] FOREIGN KEY
    (
        [PracticeID]
    ) REFERENCES [dbo].[Practice] (
        [PracticeID]
    ) ON DELETE CASCADE ON UPDATE CASCADE

ALTER TABLE [dbo].[PracticeDetails] ADD
    CONSTRAINT [FK_PracticeDetails_Practice] FOREIGN KEY
    (
```

```

        [PracticeID]
    ) REFERENCES [dbo].[Practice] (
        [PracticeID]
    ) ON DELETE CASCADE ON UPDATE CASCADE,
    CONSTRAINT [FK_PracticeDetails_Treatments] FOREIGN KEY
    (
        [TreatmentID]
    ) REFERENCES [dbo].[Treatments] (
        [TreatmentID]
    ) ON UPDATE CASCADE

```

2.6 Database Schema

After creating my database, I use the *Diagrams* tool of SQL server to see the relationships and constraints between the tables. Following figure shows the database schema created.

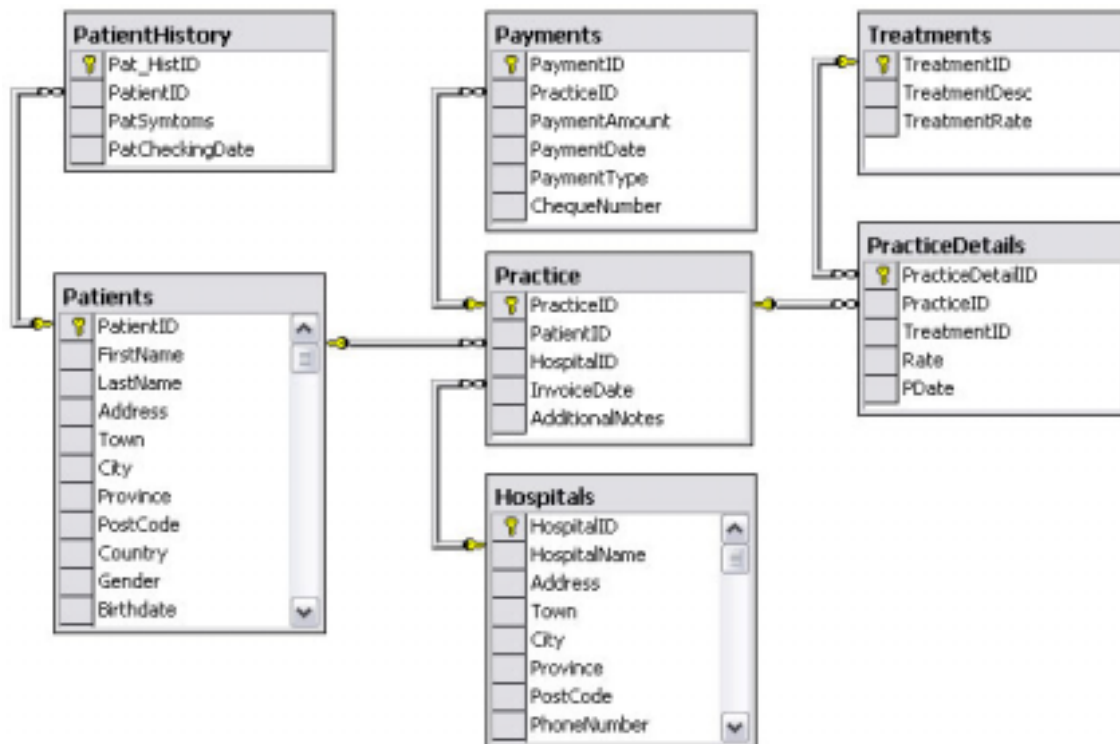


Fig 03: Database Schema for PDWA

2.7 Database Schema with Attribute types and Size

The next figure shows the database schema with Primary keys, foreign keys and other attributes with these Data Types and Sizes as specified during the database creation process.

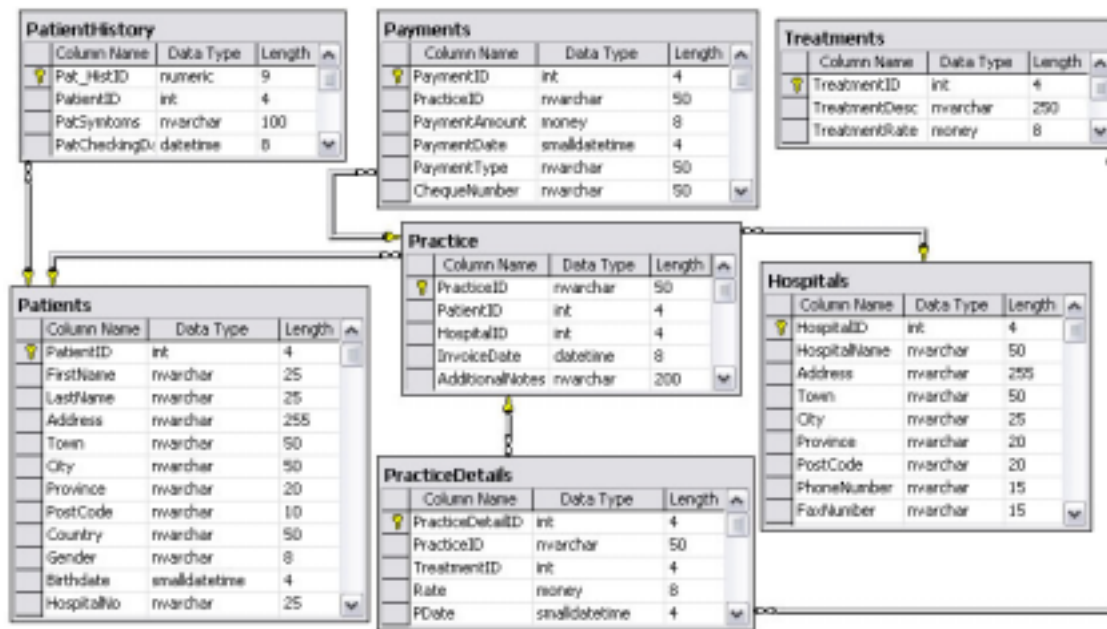


Fig 04: Database Schema with Types and Size

2.8 Star Schema

After establishing relational database, we are now able to produce dimensions and a fact table for those dimensions to start building our data warehouse. The following diagram illustrates Star Schema for our personal data warehouse.

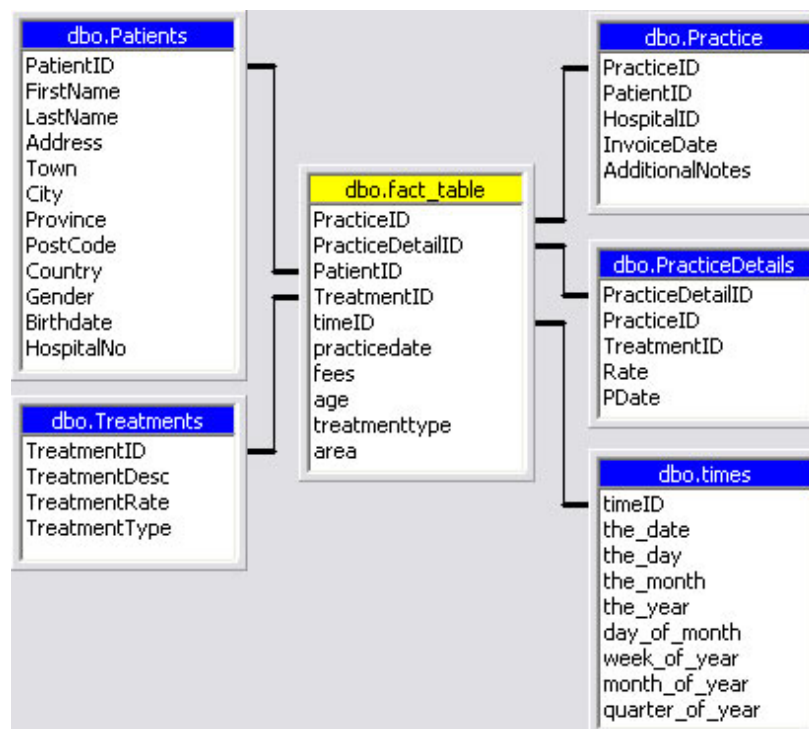


Fig 05: Star Schema for PDWA

2.9 SQL Queries

2.9.1 Insert command for Patients table

Following command can be used to populate patients table with data.

Input:

```
INSERT INTO patients (firstname, lastname, address, town, city,
                      province, postcode, country, gender, birthdate,
                      hospitalno)
VALUES ('Fahad', 'Habib', '123 London Road,', 'Ilford', 'London',
        'Essex', 'IG2 6RY', 'UK', 'Male',
        '1-Aug-1980', 'K123456')
```

Output:

```
(1 row(s) affected)
```

2.9.2 Insert command for Fact Table

Following command can be used to populate our fact_table with data from various tables.

Input:

```
INSERT fact_table

EXECUTE('
    SELECT distinct p.PracticeID,
    pd.PracticeDetailID, pa.PatientID, t.treatmentID, ti.timeid,
    pd.pdate, pd.rate, (Year(getutcdate())-Year(pa.birthdate))
    AS age, t.treatmenttype, pa.town

    FROM   practice p, patients pa, practicedetails pd, treatments t

    WHERE  p.patientid = pa.patientid AND p.practiceid = pd.practiceid
    AND pd.treatmentid = t.treatmentid AND pd.pdate = ti.the_date
');
```

Output:

```
(27 row(s) affected)
```

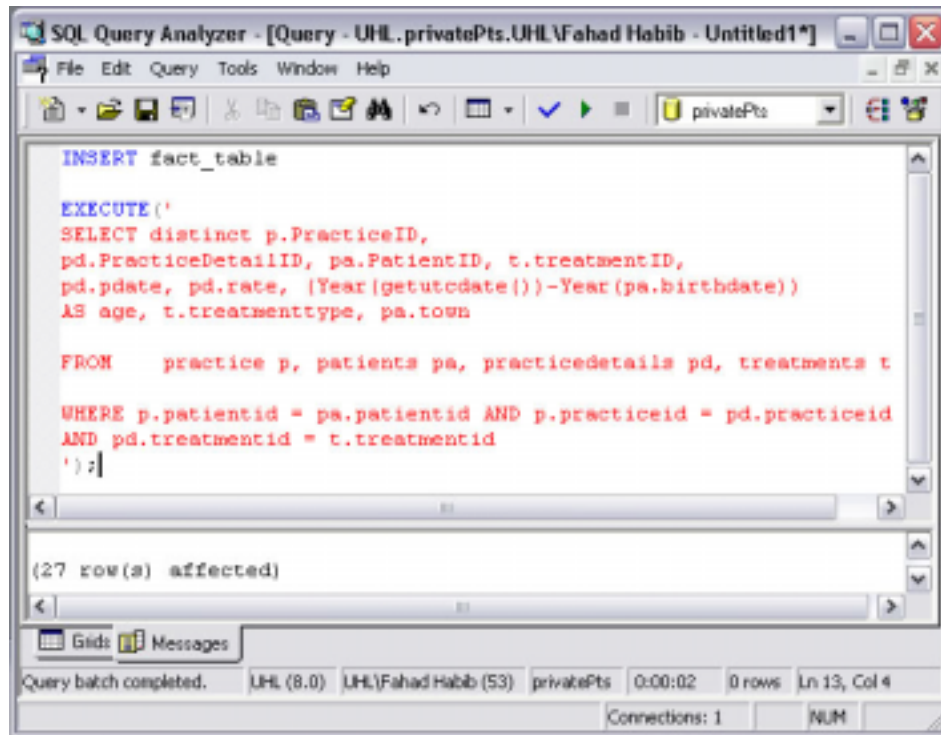


Fig 06: Insert command for Fact Table

2.9.3 Select command for Patients table

Input:

```

SELECT patientid as pid, lastname, address, town, postcode
FROM patients

```

Output:

pid	lastname	address	town	postcode
1	Moody	15 Cheside Road	East Ham	E10 2CD
2	Roth	23 Wickford Gardens, Reebok Road	Romford	RM2 6SH
3	Clarke	285 Hudson Close	Dagenham	RM11 6BL
4	Bathe	29 Wisdom Road	East Ham	E6 2QJ
5	Walker	53 Stamford Park Avenue	Ilford	IG2 7ER
6	Bang	34 Millford Avenue, Gants Hill	Ilford	IG3 8JX
7	Brown	Trickfield Mansion, High Street	Barking	IG1 4BC
8	Margreat	71 Mystery Road	Dagenham	RM7 6DB
9	Beckham	2 Fuller Gardens	Ilford	IG3 5AK
10	Butcher	Terriffic Court, Major Road	Barking	IG11 2RQ
11	Campbell	10 Fieldway Avenue	Dagenham	RM7 7TK
12	Blake	96 Hardrock Street	Ilford	IG9 4WD
13	Gordon	13 Sydney Road	Romford	RM4 8KR
14	William	42 Speedy Drive, Gants Hill	Ilford	IG5 8WB
15	Ferguson	172 Bricken Road	Barking	IG12 7TG
16	Habib	123 London Road	Ilford	IG2 6RY

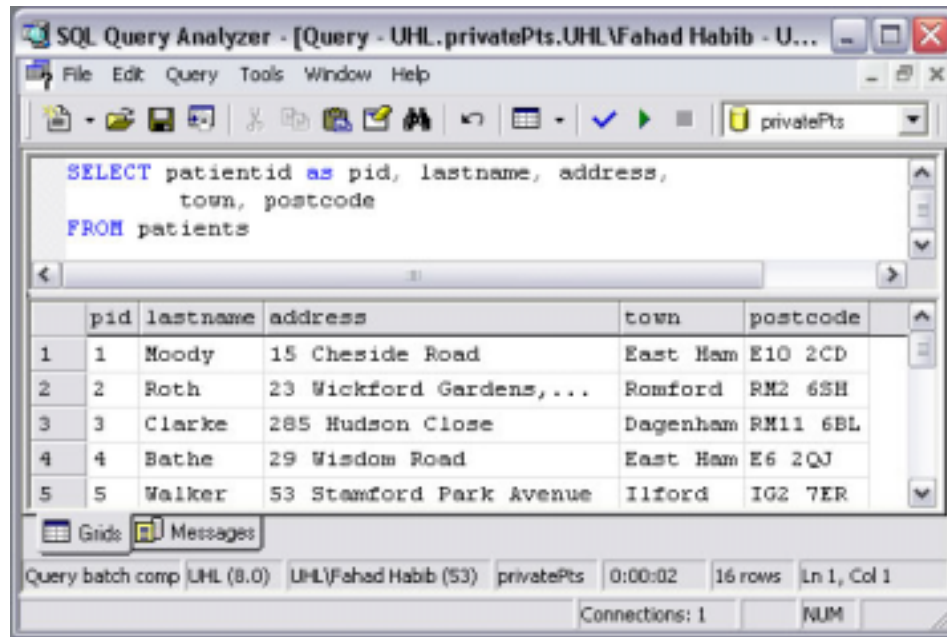


Fig 07: Select command for Patient Table

2.9.4 Select command for Fact table

Input:

```
SELECT practiceid as pracid, practicedetailid as pdid,
       patientid as pid, fees, age, area
FROM fact_table
```

Output:

pracid	pdid	pid	total_fees	age	area
KGH/0001/03	2	1	289.00	65	East Ham
KGH/0001/03	3	1	360.00	65	East Ham
KGH/0002/03	4	2	360.00	68	Romford
KGH/0004/03	5	4	289.00	31	East Ham
KGH/0005/03	6	5	360.00	77	Ilford
KGH/0005/03	7	5	508.00	77	Ilford
KGH/0006/03	8	2	508.00	68	Romford
KGH/0007/03	9	6	289.00	66	Ilford
KGH/0008/03	10	7	249.00	38	Barking
KGH/0003/03	11	3	782.00	55	Dagenham
KGH/0009/03	12	8	782.00	79	Dagenham
KGH/0009/03	13	8	386.00	79	Dagenham
KGH/0010/03	14	9	386.00	61	Ilford
KGH/0011/03	15	10	289.00	48	Barking
KGH/0012/03	16	9	548.00	61	Ilford
KGH/0012/03	17	9	386.00	61	Ilford
KGH/0012/03	18	9	400.00	61	Ilford
KGH/0013/03	19	11	782.00	27	Dagenham
KGH/0013/03	20	11	400.00	27	Dagenham
KGH/0013/03	21	11	548.00	27	Dagenham
KGH/0014/03	22	12	360.00	78	Ilford
KGH/0014/03	23	12	508.00	78	Ilford
KGH/0015/03	24	13	360.00	67	Romford

KGH/0016/03	25	13	508.00	67	Romford
KGH/0017/03	26	14	360.00	52	Ilford
KGH/0017/03	27	14	508.00	52	Ilford
KGH/0018/03	28	15	452.00	84	Barking

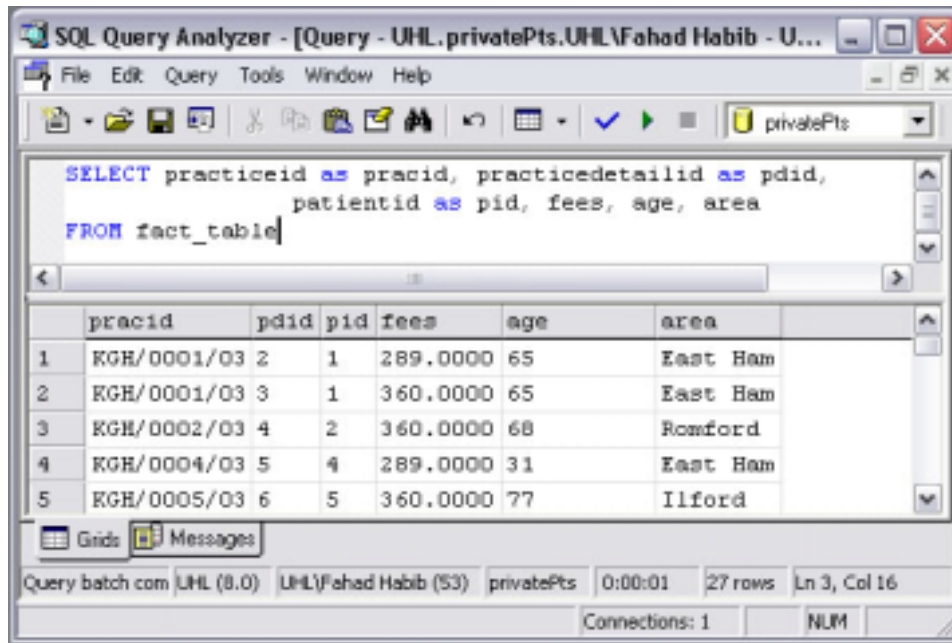


Fig 08: Select command for Fact Table

3. OLAP OPERATIONS

After creation of the database with fact table and inserting of sample records, now I am able to perform certain On-line Analytical Processing (OLAP) operations on my database.

OLAP provides a user-friendly environment for interactive data analysis ^[HK01]. Some of the typical OLAP operations are ^[HK01]:

1. Roll-up
2. Drill-down
3. Slice and Dice
4. Pivot
5. Others like
 - a. Drill across
 - b. Drill through

From these available OLAP operations, I will try to demonstrate **drill-down** and **slice** operations on my logical data cube according to my scenario and information available. First of all let me formulate my base cuboid, depending on that base cuboid I will perform OLAP operations.

3.1 Base Cuboid

To make a base cuboid, following measure can be assumed according to my scenario.

“We want to calculate Average Fees (fees) earned from different Areas (towns) of the city and of different Treatments (types) over specific amount of Time (quarters).”

The aim of this measure is to analyze the earnings and possible treatment from different geographical location and to predict the future practice of patients from dissimilar areas. After calculating this measure, by just asking area of the patient, we can assess that what kind of treatment we may provide and how much practice we can expect from that patient.

Following query based on my fact table will show the data required for this cuboid.

Input:

```
SELECT t.quarter_of_year AS Quarters, Avg(ft.fees) AS Avg_Fees,
       ft.Area, ft.TreatmentType
FROM fact_table ft, times t
WHERE ft.timeid = t.timeid
GROUP by ft.area, ft.treatmenttype, t.quarter_of_year
ORDER BY t.quarter_of_year
```

Output:

Quarters	Avg_Fees	Area	TreatmentType
-----	-----	-----	-----
Q1	269.00	Barking	Biopsy
Q1	400.00	Dagenham	Nephrostogram
Q1	548.00	Dagenham	Other
Q1	683.00	Dagenham	Urinary
Q1	360.00	East Ham	Angiogram
Q1	289.00	East Ham	Biopsy
Q1	360.00	Ilford	Angiogram
Q1	508.00	Ilford	Angioplasty
Q1	289.00	Ilford	Biopsy
Q1	393.00	Ilford	Nephrostogram
Q1	548.00	Ilford	Other
Q1	386.00	Ilford	Urinary
Q1	360.00	Romford	Angiogram
Q1	508.00	Romford	Angioplasty
Q2	452.00	Barking	Drainage
Q2	360.00	Ilford	Angiogram
Q2	508.00	Ilford	Angioplasty
Q2	508.00	Romford	Angioplasty

The above output shows the result according to the scenario as described before. Now I will formulate the cube that shows this data in form of a cube. The cube may look like this:

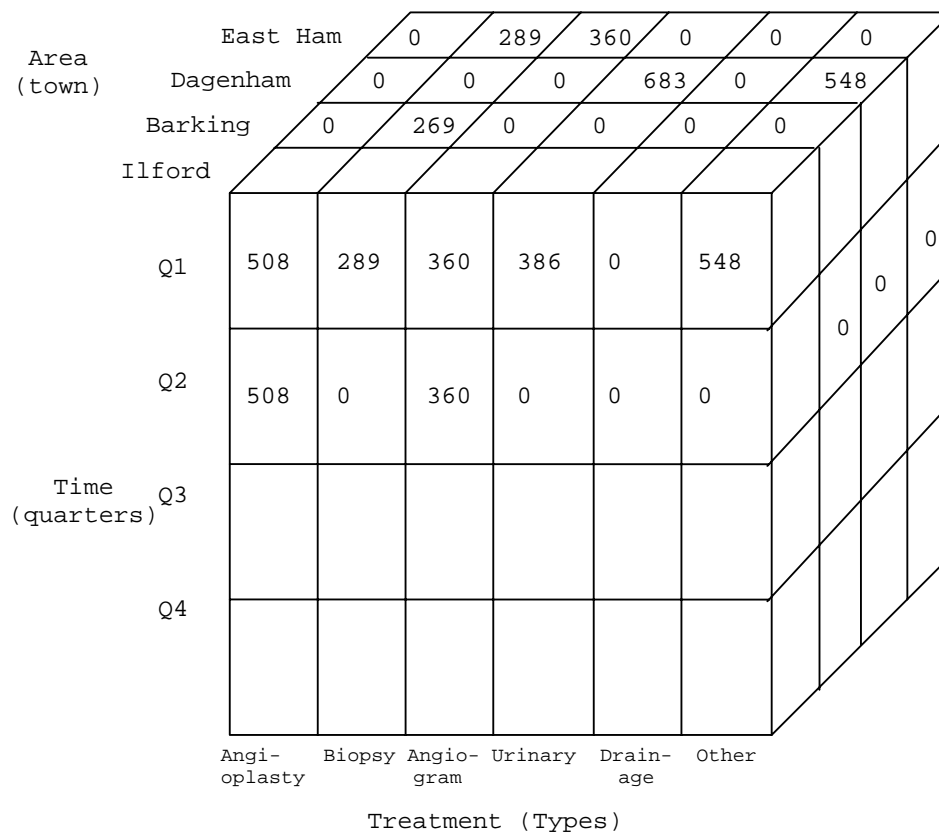


Fig 09: Base Cube showing Average Fees

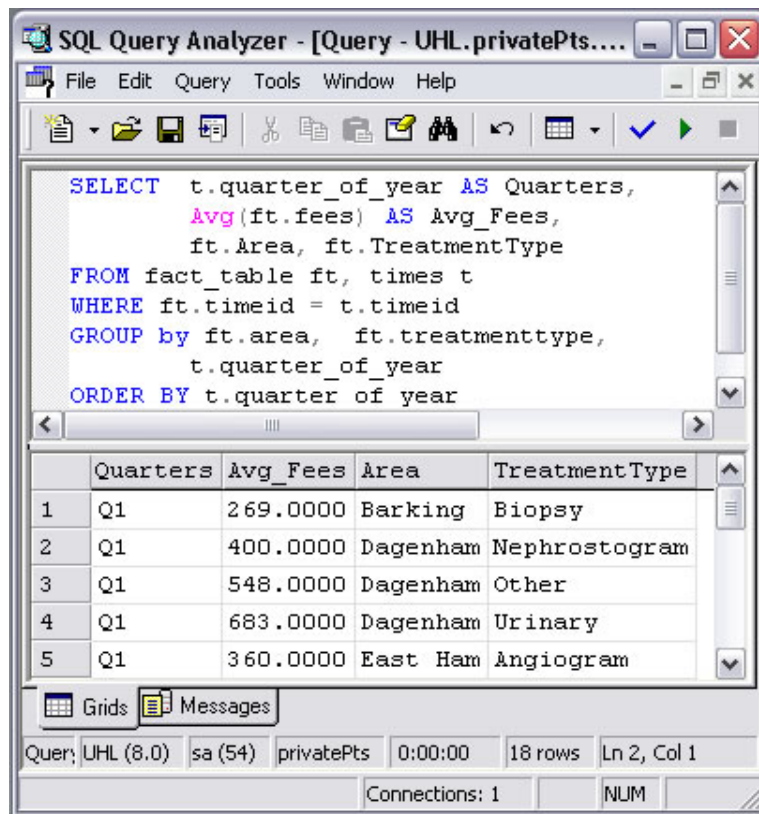


Fig 10: Screenshot for Base Cube query

3.2 ROLAP Operations

ROLAP stands for Relational On-Line Analytical Processing. It is a product that provides multidimensional analysis of data, aggregates and metadata stored in an RDBMS. The multidimensional processing may be done within the RDBMS, a mid-tier server or the client. A 'merchant' ROLAP is one from an independent vendor which can work with any standard RDBMS ^[NP03].

Based on the above cube and query, following operations can be performed.

3.2.1 Drill-Down Operation

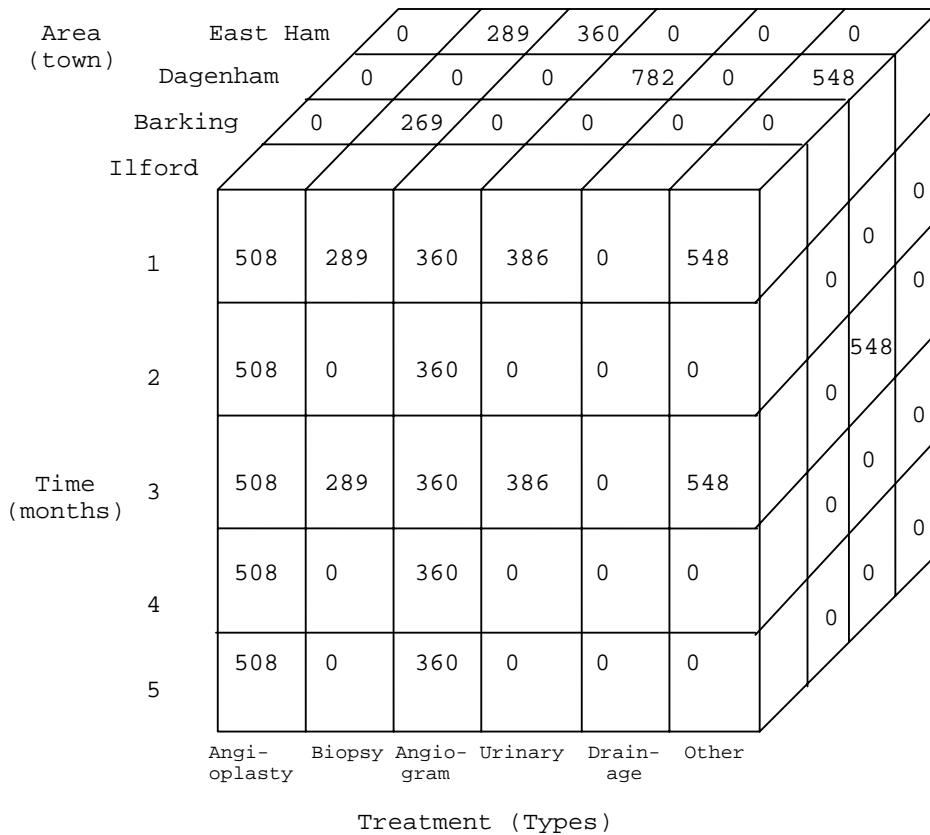
In drill-down, we navigate from less detailed data to more detailed data ^[HK01]. In my scenario I have hierarchy on time as day < month < quarters < year, so on base cube, I can move from quarters to months to each day records for more detail analysis.

Input:

```
SELECT t.month_of_year AS Months,
       Avg(ft.fees) AS Avg_Fees,
       ft.Area, ft.TreatmentType
FROM fact_table ft, times t
WHERE ft.timeid = t.timeid
GROUP by ft.area, ft.treatmenttype, t.month_of_year
ORDER BY t.month_of_year
```

Output:

Months	Avg_Fees	Area	TreatmentType
1	360.00	East Ham	Angiogram
1	289.00	East Ham	Biopsy
1	360.00	Romford	Angiogram
2	782.00	Dagenham	Urinary
2	289.00	East Ham	Biopsy
2	360.00	Ilford	Angiogram
2	508.00	Ilford	Angioplasty
2	508.00	Romford	Angioplasty
3	269.00	Barking	Biopsy
3	400.00	Dagenham	Nephrostogram
3	548.00	Dagenham	Other
3	650.00	Dagenham	Urinary
3	360.00	Ilford	Angiogram
3	508.00	Ilford	Angioplasty
3	289.00	Ilford	Biopsy
3	393.00	Ilford	Nephrostogram
3	548.00	Ilford	Other
3	386.00	Ilford	Urinary
3	360.00	Romford	Angiogram
4	360.00	Ilford	Angiogram
4	508.00	Ilford	Angioplasty
4	508.00	Romford	Angioplasty
5	452.00	Barking	Drainage

**Fig 11:** Drill-down operation data cube

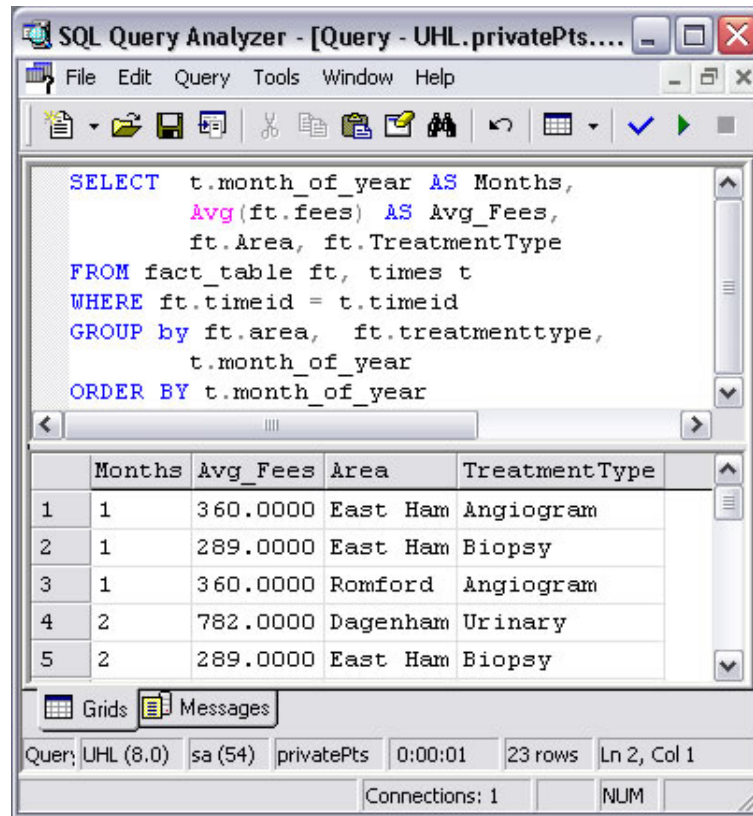


Fig 12: Screenshot for Drill-down operation

3.2.2 Slice Operation

This operation performs a selection on one dimension of the given cube, resulting in a sub cube ^[HK01].

Input:

```
SELECT t.quarter_of_year AS Quarters,
       Avg(ft.fees) AS Avg_Fees,
       ft.Area, ft.TreatmentType
FROM fact_table ft, times t
WHERE ft.timeid = t.timeid AND t.quarter_of_year = 'Q2'
GROUP BY ft.area, ft.treatmenttype, t.quarter_of_year
```

Output:

Quarter	Avg_Fees	Area	TreatmentType
Q2	452.00	Barking	Drainage
Q2	360.00	Ilford	Angiogram
Q2	508.00	Ilford	Angioplasty
Q2	508.00	Romford	Angioplasty

Area (town)	Ilford	508	0	360	0	0	0
	Barking	508	0	360	0	452	0
	Dagenham	0	0	0	0	0	0
	East Ham	0	0	0	0	0	0
		Angi- oplasty	Biopsy	Angio- gram	Urinary	Drain- age	Other
		Treatment (Types)					

Fig 13: Slice Operation Data for Quarter = 'Q2'

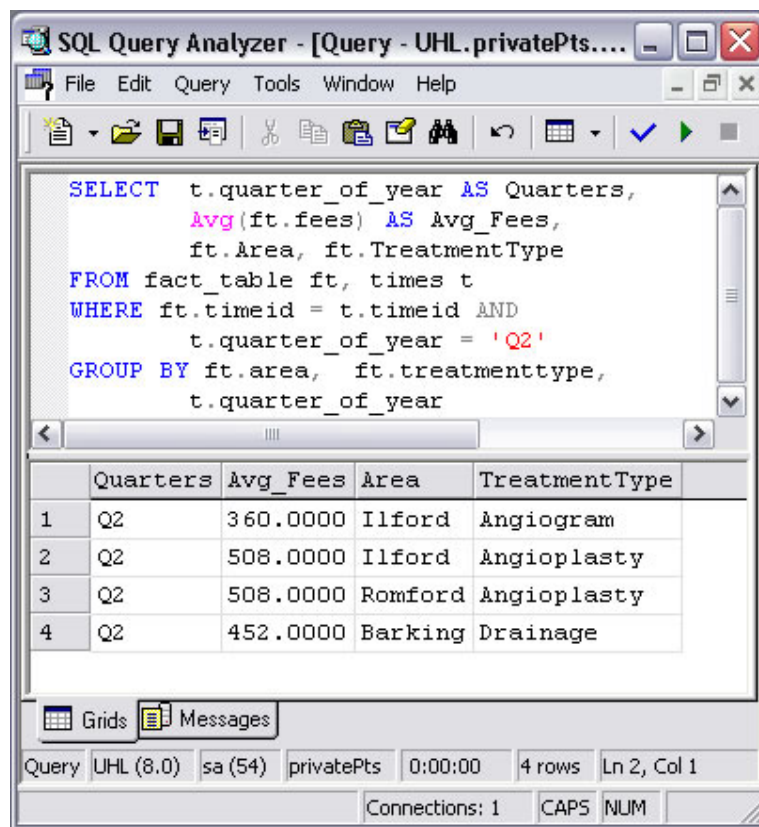


Fig 14: Screenshot of Slice Operation

4. BITMAP INDEXING

4.1 What is Bitmap Indexing?

It is a method in OLAP products that allows quick searching in data cubes. In bitmap index for a given attribute, there is a distinct bit vector, B_v , for each value v in the domain of the attribute. If the domain of the given attribute consists of n values, then n bits are needed for each entry in the bitmap index. If the attribute has the value v for a given row in the data table, then the bit representing that value is set to 1 in the corresponding row of the bitmap index. All other bits for that row are set to 0 ^[HK01].

4.2 Bitmap Indexing and PDWA

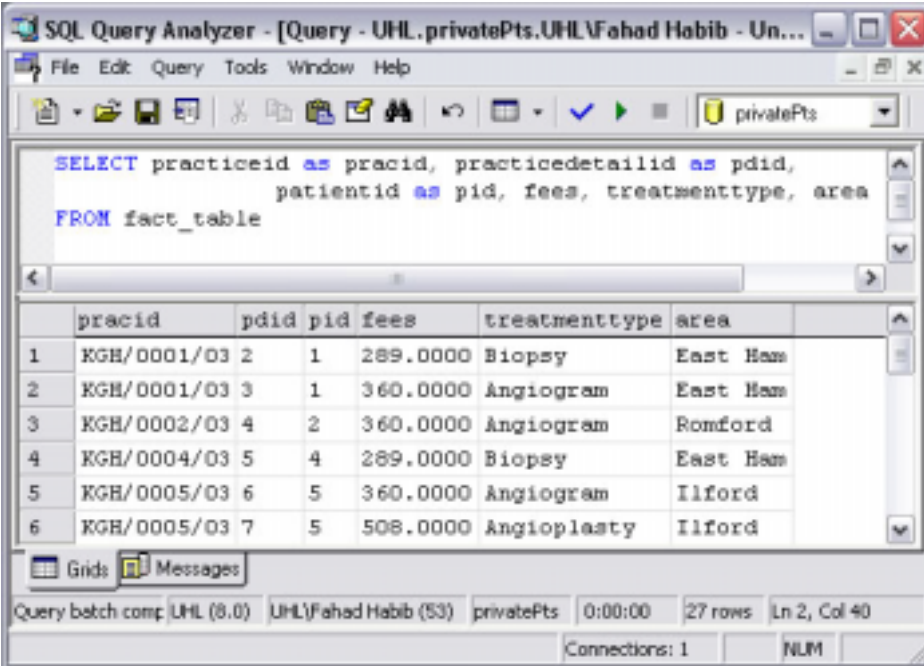
For our database, in `PracticeDetails` we have `TreatmentType` which represent the treatments performed on patients during past times. If we use this attribute for bitmap indexing then we will come across with the following table:

Input:

```
SELECT practiceid as pracid, practicedetailid as pdid,
       patientid as pid, fees, treatmenttype, area
FROM fact_table
```

Output:

pracid	pdid	pid	fees	treatmenttype	area
-----	-----	-----	-----	-----	-----
KGH/0001/03	2	1	289.00	Biopsy	East Ham
KGH/0001/03	3	1	360.00	Angiogram	East Ham
KGH/0002/03	4	2	360.00	Angiogram	Romford
KGH/0003/03	11	3	782.00	Urinary	Dagenham
KGH/0004/03	5	4	289.00	Biopsy	East Ham
KGH/0005/03	6	5	360.00	Angiogram	Ilford
KGH/0005/03	7	5	508.00	Angioplasty	Ilford
KGH/0006/03	8	2	508.00	Angioplasty	Romford
KGH/0007/03	9	6	289.00	Biopsy	Ilford
KGH/0008/03	10	7	249.00	Biopsy	Barking
KGH/0009/03	12	8	782.00	Urinary	Dagenham
KGH/0009/03	13	8	386.00	Urinary	Dagenham
KGH/0010/03	14	9	386.00	Urinary	Ilford
KGH/0011/03	15	10	289.00	Biopsy	Barking
KGH/0012/03	16	9	548.00	Other	Ilford
KGH/0012/03	17	9	386.00	Nephrostogram	Ilford
KGH/0012/03	18	9	400.00	Nephrostogram	Ilford
KGH/0013/03	19	11	782.00	Urinary	Dagenham
KGH/0013/03	20	11	400.00	Nephrostogram	Dagenham
KGH/0013/03	21	11	548.00	Other	Dagenham
KGH/0014/03	22	12	360.00	Angiogram	Ilford
KGH/0014/03	23	12	508.00	Angioplasty	Ilford
KGH/0015/03	24	13	360.00	Angiogram	Romford
KGH/0016/03	25	13	508.00	Angioplasty	Romford
KGH/0017/03	26	14	360.00	Angiogram	Ilford
KGH/0017/03	27	14	508.00	Angioplasty	Ilford
KGH/0018/03	28	15	452.00	Drainage	Barking



The screenshot shows the SQL Query Analyzer window with the following query and results:

```

SELECT practiceid as pracid, practicedetailid as pdid,
       patientid as pid, fees, treatmenttype, area
FROM fact_table

```

	pracid	pdid	pid	fees	treatmenttype	area
1	KGH/0001/03	2	1	289.0000	Biopsy	East Ham
2	KGH/0001/03	3	1	360.0000	Angiogram	East Ham
3	KGH/0002/03	4	2	360.0000	Angiogram	Romford
4	KGH/0004/03	5	4	289.0000	Biopsy	East Ham
5	KGH/0005/03	6	5	360.0000	Angiogram	Ilford
6	KGH/0005/03	7	5	508.0000	Angioplasty	Ilford

Query batch comp: UHL (8.0) UHL\Fahad Habib (53) privatePts 0:00:00 27 rows Ln 2, Col 40
Connections: 1 NUM

Fig 15: Fact table for Bitmap Indexing

4.2.1 Bitmap Indexing Table

For each practice record e.g. KGH/0001/03, we have one or more type of treatment type. There are total 18 rows in the Practice table, which have 27 corresponding rows in practicedetails table. Therefore we have 27 rows in fact_table, consisting of all records. Following table indicates treatment type appearing in each Practice.

	Angiogram	Angioplasty	Biopsy	Drainage	Nephrostogram	Urinary	Other
1	1	0	1	0	0	0	0
2	1	0	0	0	0	0	0
3	0	0	0	0	0	1	0
4	0	0	1	0	0	0	0
5	1	1	0	0	0	0	0
6	0	1	0	0	0	0	0
7	0	0	1	0	0	0	0
8	0	0	1	0	0	0	0
9	0	0	1	0	0	1	0
10	0	0	0	0	0	1	0
11	0	0	1	0	0	0	0
12	0	0	0	0	1	0	1
13	0	0	0	0	1	1	0
14	1	1	0	0	0	0	0
15	1	0	0	0	0	0	1
16	0	1	0	0	1	0	0
17	1	1	0	0	1	0	0
18	0	0	0	0	0	1	0

Fig 16: Bitmap Index Table

4.3 Advantages

Some of the advantages of the bitmap index are as follows ^[VG99]:

- It is simple to represent and consume less disk space as compared to other techniques.
- It is quick and CPU-efficient as it uses bitwise operators.
- It is easy to update bitmap index table after addition of new data.
- It is suitable for data warehouses where we have low-cardinality columns.
- It can be used as an alternate method of the row ids representation.

4.4 Disadvantages

Some of the disadvantages of the bitmap index are ^[VG99]:

- It creates large number of spare/unused data that's never needed.
- It is not suitable for warehouses with high cardinality columns.
- More query processing time and space needed to build and answer queries involving high cardinality columns.

5. HIGH LEVEL LANGUAGE IMPLEMENTATION

5.1 What is MOLAP?

MOLAP (multidimensional online analytical processing) is online analytical processing (OLAP) that indexes directly into a multidimensional database. In general, an OLAP application treats data multidimensionally; the user is able to view different aspects or facets of data aggregates such as sales by time, geography, and product model. If the data is stored in a relational data base, it can be viewed multidimensionally, but only by successively accessing and processing a table for each dimension or aspect of a data aggregate^[TT03].

5.2 Front End Application

The application to demonstrate multidimensional array for MOLAP operation is designed using Visual Basic 6. The simple interface of the application requires user input for the array to be filled and shows data in the form that resembles with the ROLAP operations performed using SQL queries.

It also shows the results we get with our base cuboid. The application establishes a link with our SQL Server database, fetch data according to our base cube query and display results in a textbox. The interface of the application is as follows:

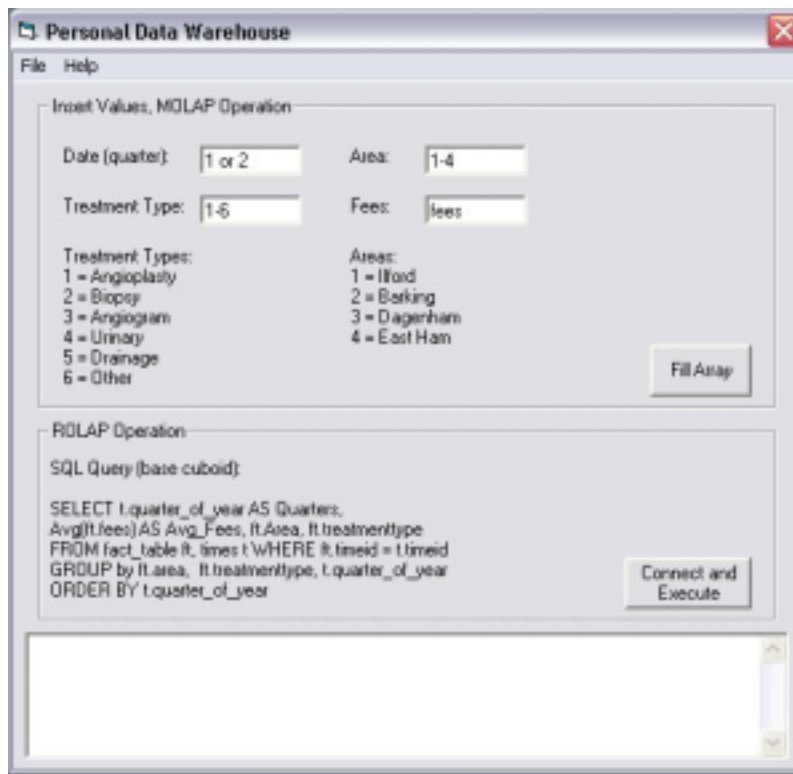


Fig 17: Front-end Application screenshot

5.3 MOLAP Operation

The application requires user interaction by asking for the values for multidimensional array. The array accepts the values within certain limits so that I can demonstrate according to my scenario with some values.

After getting desired input values, the data will be stored in a 3-dimensional array of fixed length. The length of the array is set according to the scenario and base cube requirements. We can add as many values as we want. All relevant data will be updated according to the values provided.

After inserting values, we can view the contents of the multidimensional array in the form of an array data table. The array data table resembles with the actual base cube results as in ROLAP operation.

The screenshot shows a window titled "Personal Data Warehouse" with a menu bar (File, Help). The main area is divided into two sections: "Insert Values, MOLAP Operation" and "ROLAP Operation".

Insert Values, MOLAP Operation:

- Input fields: Date (quarter): 1, Area: 1, Treatment Type: 1, Fees: 500.
- Lists:
 - Treatment Types: 1 = Angioplasty, 2 = Biopsy, 3 = Angiogram, 4 = Urinary, 5 = Drainage, 6 = Other.
 - Areas: 1 = Ilford, 2 = Barking, 3 = Dagenham, 4 = East Ham.
- Buttons: Empty Array, Show Array, Fill Array.

ROLAP Operation:

- Text: SQL Query (base cuboid):
- Code:


```
SELECT t.quarter_of_year AS Quarters,
Avg(f.fees) AS Avg_Fees, f.area, f.treatmenttype
FROM fact_table f, times t WHERE f.timeid = t.timeid
GROUP by f.area, f.treatmenttype, t.quarter_of_year
ORDER BY t.quarter_of_year
```
- Button: Connect and Execute.

Datacube[1,1,1] = 500

Datacube arranged in form of table:

Quarter	AvgFees	Area	TreatmentType
---------	---------	------	---------------

Fig 18: MOLAP Operation, inserting and retrieving values

To demonstrate the resemblance with actual base cube, we can establish link with the actual database and fetch the base cuboid data. After fetching data, the application will show values in the textbox in the form of a table. The information retrieved resembles with the multidimensional array values we just created.

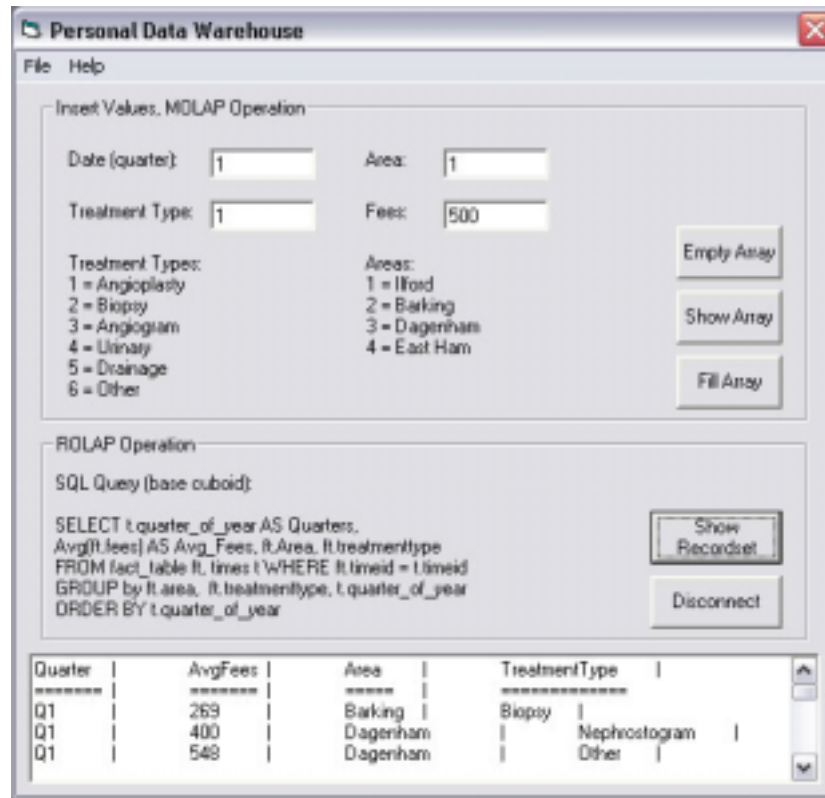


Fig 19: MOLAP vs ROLAP, Getting data from database

After performing required operations on our multidimensional array, we can empty and fill it again with new data to test again. Similarly, we can disconnect with our SQL server database and free the system resources.

5.4 Comparison between ROLAP and MOLAP

Following points can be noticed between two operations ^[TT03].

- MOLAP processes data that is already stored in a multidimensional array whereas in case of ROLAP we have to fetch data from database ^[TT03].
- MOLAP reflects all possible combinations of data, each in a cell that can be accessed directly whereas in case of ROLAP we have to formulate our data according to our required to create potential arrangement ^[TT03].

For these reasons, MOLAP is, for most uses, faster and more user-responsive than relational online analytical processing (ROLAP) ^[TT03].

There is also hybrid OLAP (HOLAP), which combines some features from both ROLAP and MOLAP ^[TT03].

5.5 Conclusion

In my opinion, the MOLAP operation is more difficult than ROLAP operation. The reason behind this is the uncertain size of our multidimensional array. For small database, we can perform MOLAP operation easily, but for large and complex databases, MOLAP operation looks difficult to implement.

On the other hand ROLAP operation looks much simpler and easier to understand and implement on databases of all sizes. But according to experts ^[TT03], as mentioned earlier, the MOLAP is faster than ROLAP.

6. SPARSE MATRIX PROBLEM

6.1 What is Sparse Matrix?

It is a matrix with small number of non-zero values ^[JK02]. Thus, only a small proportion of potential data cells actually occupied in a multidimensional structure ^[NP03].

6.2 Example

For my PDWA, following cube shows a sparse data cube:

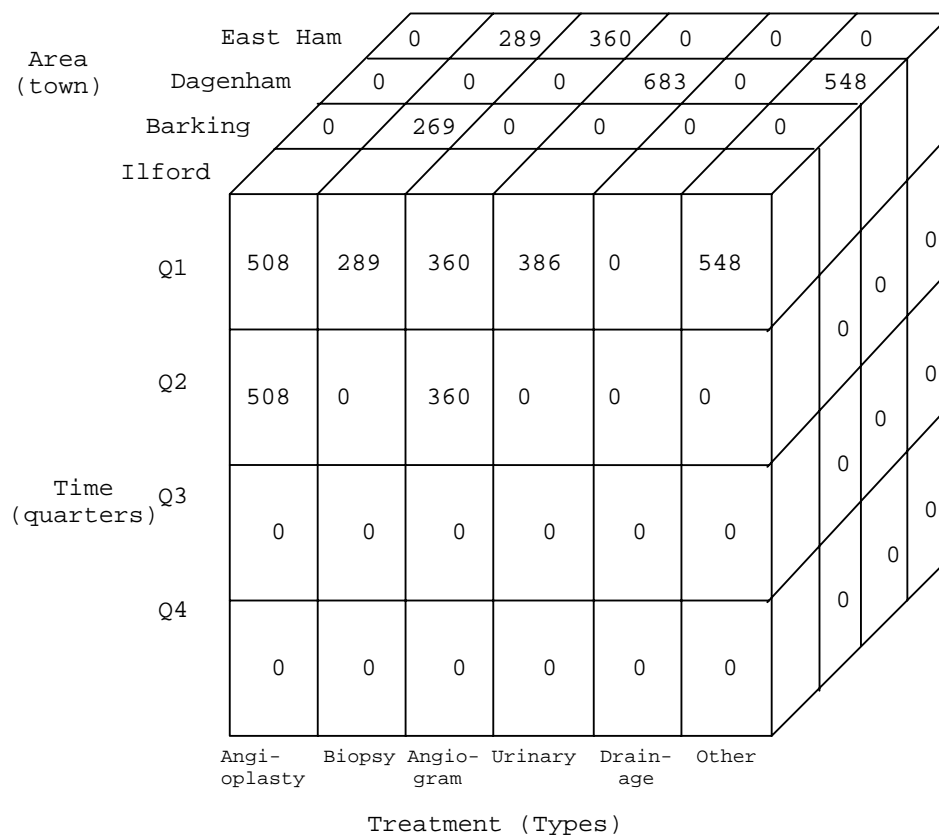


Fig 20: Sparse Data Cube

It is obvious from the above example, that we have large amount of useless data in the cube. There are more zero values than non-zero ones, hence making our cube inefficient and sparse.

Since this PDWA is not big as compared to the actual, real-time scenario, but still it creates problem of useless values for us. So for real life situations, this problem will increase many times as we have large amount of data. Hence it is clear that we will get huge sparse data cubes for actual data warehouse applications.

6.3 Solution

To overcome this problem, we may implement linked lists. In linked lists we allocate values dynamically, hence more space efficient than multidimensional arrays. With arrays, we have to mention size before assigning values, therefore it consumes huge amount of disk space and also reduces the efficiency of data cube by adding useless data.

On the other hand with linked lists, we can add only those values which are non-zero and useful for us, hence eliminating the problem of sparse data cube.

6.4 Alternative Solution

According to Jong Kim ^[JK02], the pointers can be used to overcome the sparse matrix problem in multidimensional OLAP. Following example shows Kim's view about sparse matrix implementation.

6.4.1 Example

Suppose we have ^[JK02]:

- 1000 X 1000 matrix with 2000 entries
- 2-dimensional array implementation
 - $1000 * 1000 * 8 \text{ byte} = 8\text{M byte}$
 - Matrix inversion requires temporary matrices
- Pointer implementation
 - $2000 * (4(\text{row pointer}) + 4(\text{column pointer}) + 2(\text{row number}) + 2(\text{column number}) + 8(\text{value})) = 40\text{Kbyte}$

This example illustrates how Kim overcomes the problem of sparse matrix using pointers and reduces the large useless space to small useful data.

7. THE 4D CUBE

For showing 4D cube according to my scenario, I will add another measure age in my base cuboid measures. By adding this new measure I can generate different cubes according to my base cube criteria, and will show values for different ages or age ranges.

It will help me in creating a series of 3D cubes and enable me to demonstrate 4D cube visualization for my PDWA.

7.1 Series of 3D Cubes

For generating series of 3D cubes to represent a 4D cube, following queries are used:

Input:

Query1, Age <= 35:

```
SELECT t.quarter_of_year AS Quarters,
       Avg(ft.fees) AS Avg_Fees, '<=35' AS Age_Range,
       ft.area, ft.treatmenttype
FROM fact_table ft, times t
WHERE ft.timeid = t.timeid AND ft.age <=35
GROUP BY ft.area, ft.treatmenttype, t.quarter_of_year
ORDER BY t.quarter_of_year
```

Query2, Age >35 and Age <= 65:

```
SELECT t.quarter_of_year AS Quarters,
       Avg(ft.fees) AS Avg_Fees, '>35 and <=65' AS Age_Range,
       ft.area, ft.treatmenttype
FROM fact_table ft, times t
WHERE ft.timeid = t.timeid AND (ft.age > 35 AND ft.age <= 65)
GROUP BY ft.area, ft.treatmenttype, t.quarter_of_year
ORDER BY t.quarter_of_year
```

Query3, Age > 65:

```
SELECT t.quarter_of_year AS Quarters,
       Avg(ft.fees) AS Avg_Fees, '>65' AS Age_Range,
       ft.area, ft.treatmenttype
FROM fact_table ft, times t
WHERE ft.timeid = t.timeid AND ft.age >65
GROUP BY ft.area, ft.treatmenttype, t.quarter_of_year
ORDER BY t.quarter_of_year
```

Output:

Query1, Age <= 35:

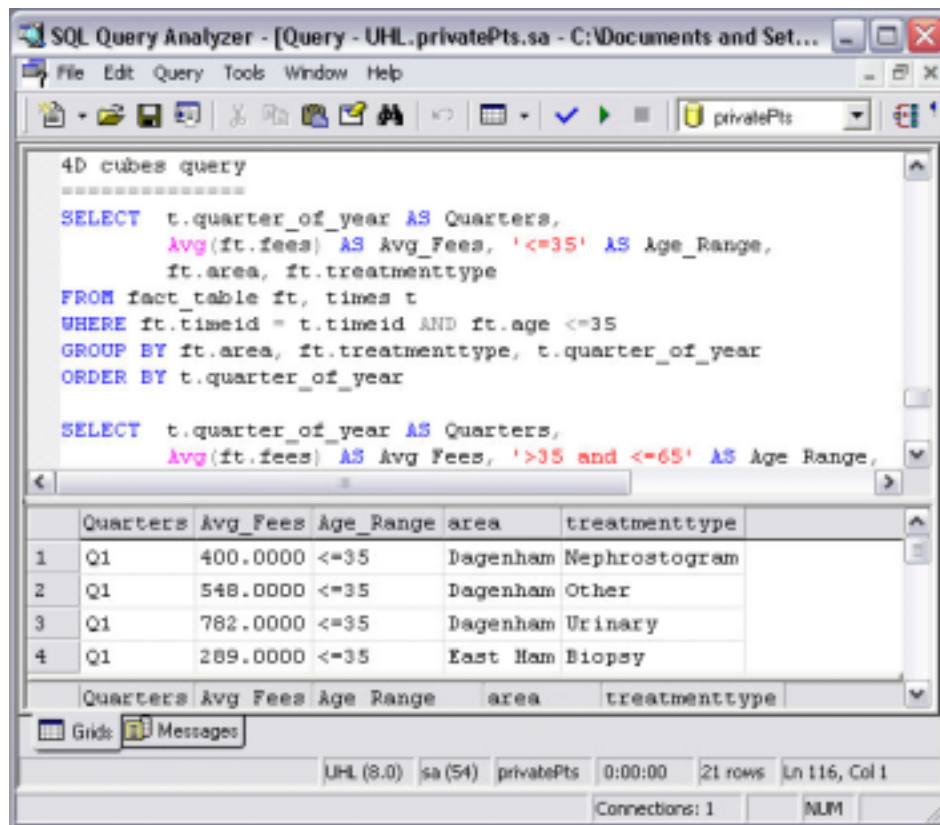
Quarters	Avg_Fees	Age	Town	TreatmentType
-----	-----	----	-----	-----
Q1	400.00	<=35	Dagenham	Nephrostogram
Q1	548.00	<=35	Dagenham	Other
Q1	782.00	<=35	Dagenham	Urinary
Q1	289.00	<=35	East Ham	Biopsy

Query2, Age >35 and Age <= 65:

Quarters	Avg_Fees	Age	Town	TreatmentType
Q1	269.00	>35 and <=65	Barking	Biopsy
Q1	782.00	>35 and <=65	Dagenham	Urinary
Q1	360.00	>35 and <=65	East Ham	Angiogram
Q1	289.00	>35 and <=65	East Ham	Biopsy
Q1	393.00	>35 and <=65	Ilford	Nephrostogram
Q1	548.00	>35 and <=65	Ilford	Other
Q1	386.00	>35 and <=65	Ilford	Urinary
Q2	360.00	>35 and <=65	Ilford	Angiogram
Q2	508.00	>35 and <=65	Ilford	Angioplasty

Query3, Age > 65:

Quarters	Avg_Fees	Age	Town	TreatmentType
Q1	584.00	>65	Dagenham	Urinary
Q1	360.00	>65	Ilford	Angiogram
Q1	508.00	>65	Ilford	Angioplasty
Q1	289.00	>65	Ilford	Biopsy
Q1	360.00	>65	Romford	Angiogram
Q1	508.00	>65	Romford	Angioplasty
Q2	452.00	>65	Barking	Drainage
Q2	508.00	>65	Romford	Angioplasty

**Fig 21:** 4D Cube query screenshot

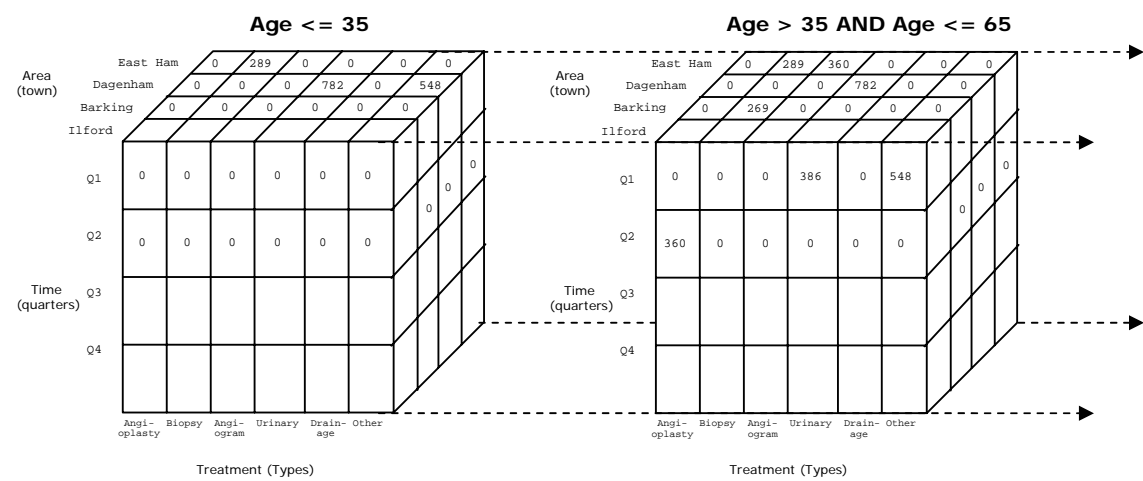


Fig 22: Series of 3D cubes

7.2 Conclusion

Thus, it is possible to show the 4D cube using a series of 3D cubes to overcome the tricky problem of showing data in the form of 4D cube.

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