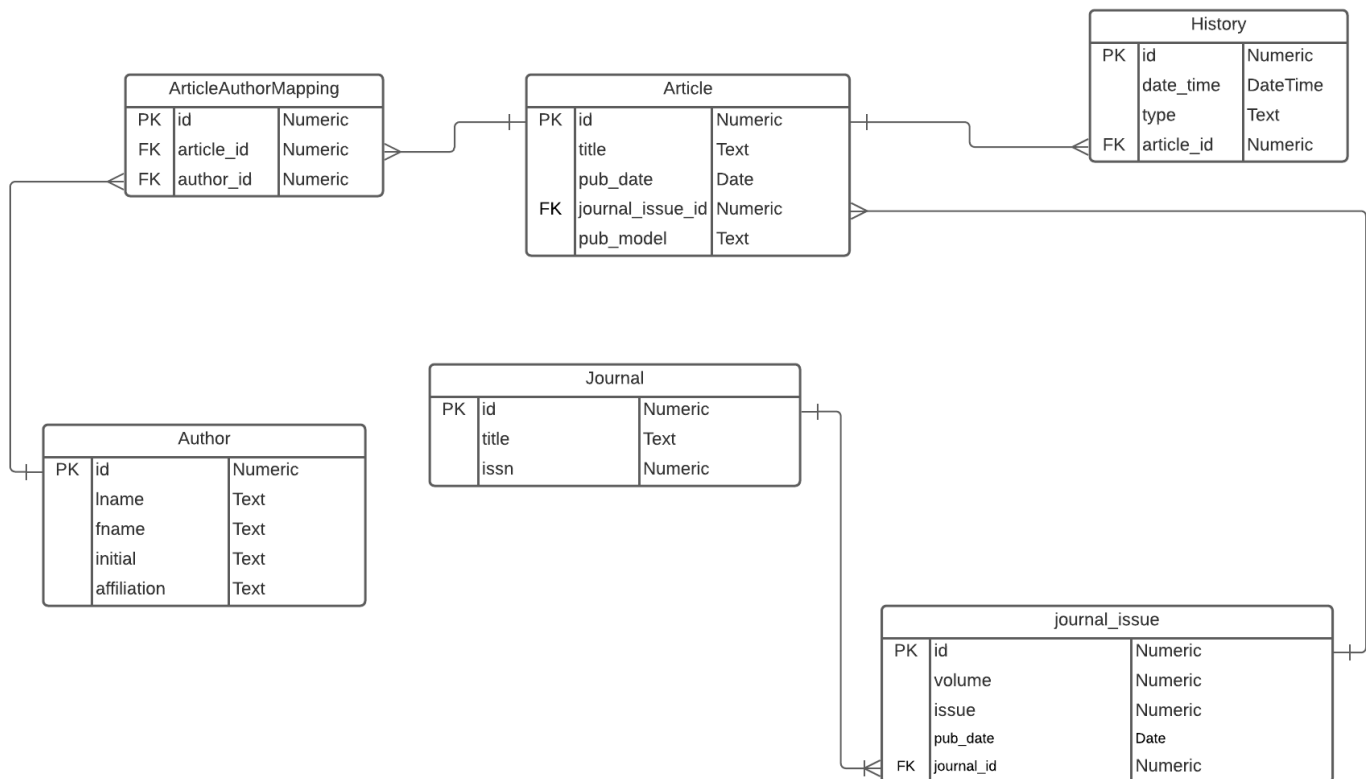


# Practicum 2 | Mining a database

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## Part 1. ERD showing OLTP schema



```
# Importing required libraries
```

```
if("RMySQL" %in% rownames(installed.packages()) == FALSE) {
  install.packages("RMySQL")
}
library(RMySQL)
```

```
## Loading required package: DBI
```

```
if("XML" %in% rownames(installed.packages()) == FALSE) {
  install.packages("XML")
}
library(XML)
library(stringr)
library(dplyr)
```

```
##  
## Attaching package: 'dplyr'
```

```
## The following objects are masked from 'package:stats':  
##  
## filter, lag
```

```
## The following objects are masked from 'package:base':  
##  
## intersect, setdiff, setequal, union
```

## Support Functions

### Function: insertIntoTable

Inserts the given data frame into the given table.

```
insertIntoTable <- function(table, df) {  
  # Create chunks of 1000 rows  
  cols <- paste0(colnames(df), collapse = ",")  
  df <- split(df, ceiling(seq_along(df)/1000))  
  for(chunk in df){  
    vals <- paste0(apply(chunk, 1, function(x) paste0("'", paste0(trimws(x), collapse = "'", '  
)', "'")), collapse = ", ")  
  
    query <- paste("INSERT INTO ", table, "(", cols, ") VALUES", str_replace_all(vals, "'NA'", "NULL"  
)', ";")  
  
    dbGetQuery(dbcon, query);  
  }  
}
```

### Function: parsePubDate

Returns a parsed date from <PubDate> element.

```

parsePubDate <- function(pubDate) {

  if(!is.null(pubDate[["MedlineDate"]])){
    date = xmlValue(pubDate[["MedlineDate"]])

    # Ignore the end month
    date = str_replace(str_sub(date,1,8)," ","-")
  } else {
    date = xmlValue(pubDate[["Year"]])

    if(!is.null(pubDate[["Month"]])) {
      date = paste0(date,"-", xmlValue(pubDate[["Month"]]))
    } else {
      # Publish date
    }
  }

  if(!is.null(pubDate[["Day"]])) {
    date = paste0(date,"-", xmlValue(pubDate[["Day"]]))
  } else {
    date = paste0(date,"-","01")
  }

  if(str_length(date) < 10){
    date = ""
  } else {
    date = format(as.Date(date,"%Y-%b-%d"),"%Y-%m-%d")
  }

  return(date)
}

```

## Function: parseArticle

Returns the data frame for article when an xml object is passed to this function.

```

parseArticle <- function(ArticleItem) {
  children <- xmlChildren(ArticleItem)

  title <- xmlValue(children$ArticleTitle)
  pub_date <- ""

  if(!is.null(ArticleItem[["ArticleDate"]])){
    pub_date <- paste0(xmlValue(ArticleItem[["ArticleDate"]][["Year"]]), "-",
                      xmlValue(ArticleItem[["ArticleDate"]][["Month"]]), "- ",
                      xmlValue(ArticleItem[["ArticleDate"]][["Day"]]))
  }

  pub_model <- xmlAttrs(ArticleItem)[["PubModel"]]

  return(data.frame(
    title,
    pub_date,
    pub_model
  ))
}

```

### Function: parseHistory

Returns the data frame for History when an xml object is passed to this function.

```

parseHistory <- function(HistoryItem) {

  date_time <- paste0(xmlValue(HistoryItem[["Year"]]), "-", xmlValue(HistoryItem[["Month"]]), "- ",
                    xmlValue(HistoryItem[["Day"]]))

  type <- xmlAttrs(HistoryItem)[["PubStatus"]]

  return(data.frame(
    date_time,
    type
  ))
}

```

### Function: parseJournal

Returns the data frame for journal when an xml object is passed to this function.

```
parseJournal <- function(journalItem) {  
  children <- xmlChildren(journalItem)  
  
  title <- xmlValue(children$Title)  
  issn <- xmlValue(children$ISSN)  
  
  return(data.frame(  
    title,  
    issn  
  ))  
}
```

## Function: parseJournalIssue

Returns the data frame for journal issue when an xml object is passed to this function.

```
parseJournalIssue <- function(journalIssueItem) {  
  
  volume <- xmlValue(journalIssueItem[["Volume"]])  
  issue <- xmlValue(journalIssueItem[["Issue"]])  
  # TODO : fixed the date format  
  pub_date <- parsePubDate(journalIssueItem[["PubDate"]])  
  
  return(data.frame(  
    volume,  
    issue,  
    pub_date  
  ))  
}
```

## Function: parseAuthor

Returns the data frame for the author from an xml object which is passed to this function.

```
parseAuthor <- function(authorItem) {  
  children <- xmlChildren(authorItem)  
  lname <- xmlValue(children$LastName)  
  fname <- xmlValue(children$ForeName)  
  initial <- xmlValue(children$Initials)  
  affiliation <- xmlValue(children$Affiliation)  
  
  return(data.frame(  
    lname,  
    fname,  
    initial,  
    affiliation  
  ))  
}
```

## Function: handledateFromXml

Handles incomplete dates and returns a formatted date.

```

handleDateFromXml <- function(date){
  newFormattedDate <- ""
  if(str_length(date) == 4){
    newFormattedDate <- paste0(date,"-01-01")
  } else if(str_length(date) == 7){
    newFormattedDate <- paste0(date)
  }

  return(newFormattedDate)
}

```

## Function: rowExists

Checks if the row exists in the given data frame and returns the key of the existing row else returns 0.

```

rowExists <- function(df, row) {
  r <- nrow(df)

  if(r == 0){
    return(0)
  }

  for(a in 1:r){
    if(all(df[a,]==row[1,])) {
      return(a)
    }
  }

  return(0)
}

```

## Function: cleanString

Removes special characters and trims extra spaces from the given string and returns cleaned string.

```

cleanString <- function(dirtyString){
  cleanedString <- str_replace_all(dirtyString, "[^[:alnum:]]", " ")
  cleanedString <- trimws(gsub("\\s+", " ", cleanedString))
  return(cleanedString)
}

```

# XML Parsing

## Importing and getting an object for the XML file

```
# Importing the XML file
path <- ""
xmlFile <- "pubmed_sample.xml"
fp <- paste0(path,xmlFile)
xmlDOM <- xmlParse(fp)

# get the root node of the DOM tree
root <- xmlRoot(xmlDOM)
# get number of children of root
sizeRoot <- xmlSize(root)
```

## Creating data frames for the required entities

```
# create various data frames to hold data;
author <- data.frame (id = integer(),
                      lname = character(),
                      fname = character(),
                      initial = character(),
                      affiliation = character(),
                      stringsAsFactors = F)

journal <- data.frame (id = numeric(),
                      title = character(),
                      issn = character(),
                      stringsAsFactors = F)

journalIssue <- data.frame (id = integer(),
                           volume = integer(),
                           issue = integer(),
                           journal_id = integer(),
                           pub_date = character(),
                           stringsAsFactors = F)

article <- data.frame (id = integer(),
                      title = character(),
                      pub_date = character(),
                      journal_issue_id = integer(),
                      pub_model = character(),
                      stringsAsFactors = F)

articleAuthorMapping <- data.frame (id = integer(),
                                    author_id = integer(),
                                    article_id = integer(),
                                    stringsAsFactors = F)

history <- data.frame (id = integer(),
                      date_time = character(),
                      type = character(),
                      article_id = integer(),
                      stringsAsFactors = F)
```

## Parsing the XML and populating data frames



```

pubmedArticleXPath <- "/PubmedArticleSet/PubmedArticle"
pubmedArticleList <- xpathSApply(xmlDOM, pubmedArticleXPath)
articleId <- 1
journalId <- 1
journalIssueId <- 1
authorId <- 1
artAuthorMappingId <- 1
historyId <- 1

for(i in 1:sizeRoot){
  pubmedArticle <- pubmedArticleList[[i]]

  # Check if the publication type of the article
  # is "Journal Article" or not
  if(!grepl("Journal Article",
    xmlValue(pubmedArticle[["MedlineCitation"]][["Article"]][["PublicationTypeList"]], "Journal
Article")
  )) {
    next
  }

  # ===== <Journal> =====
  journalItem <- parseJournal(
    pubmedArticle[["MedlineCitation"]][["Article"]][["Journal"]]
  )
  journalRow = rowExists(journal[, 2:ncol(journal)], journalItem)

  if(journalRow == 0){
    journal[journalId,"id"] = journalId
    journal[journalId,"title"] = journalItem$title
    journal[journalId,"issn"] = journalItem$issn
    journalItem$id <- journalId

    journalId <- journalId + 1
  } else{
    journalItem$id <- journal$id[journalRow]
  }

  # ===== <JournalIssue> =====
  journalIssueItem <- parseJournalIssue(
    pubmedArticle[["MedlineCitation"]][["Article"]][["Journal"]][["JournalIssue"]]
  )
  journalIssueItem$journal_id <- journalItem$id

  if(rowExists(journalIssue[,2:ncol(journalIssue)], journalIssueItem) == 0){
    journalIssue[journalIssueId, "id"] = journalIssueId
    journalIssue[journalIssueId, "volume"] = journalIssueItem$volume
    journalIssue[journalIssueId, "issue"] = journalIssueItem$issue
    journalIssue[journalIssueId, "pub_date"] = journalIssueItem$pub_date
    journalIssue[journalIssueId, "journal_id"] = journalIssueItem$journal_id
  }
}

```

```

    journalIssueItem$id <- journalIssueId

    journalIssueId <- journalIssueId + 1;
}

# ===== <Article> =====
articleItem <- parseArticle(
  pubmedArticle[["MedlineCitation"]][["Article"]]
)
articleItem$journal_id = journalItem$id;

articleRow <- rowExists(article[, 2:ncol(article)], articleItem)

if(articleRow == 0){
  article[articleId,"id"] = articleId
  article[articleId,"title"] = articleItem$title
  article[articleId,"pub_date"] = articleItem$pub_date
  article[articleId,"pub_model"] = articleItem$pub_model
  article[articleId,"journal_issue_id"] = journalIssueItem$id

  articleItem$id <- articleId

  articleId <- articleId + 1
} else {
  articleItem$id <- article$id[articleRow]
}

# ===== <Author> =====
authorList = xmlChildren(pubmedArticle[["MedlineCitation"]][["Article"]][["AuthorList"]])

for(authorItem in authorList){
  authorItem <- parseAuthor(authorItem)
  # authorItem$lname = cleanString(authorItem$lname)
  # authorItem$fname = cleanString(authorItem$fname)
  # authorItem$initial = cleanString(authorItem$initial)

  authorRow <- rowExists(author[, 2:(ncol(author)-1)], authorItem[,1:(ncol(authorItem)-1)])
  if(authorRow == 0){
    author[authorId,"id"] = authorId
    author[authorId,"lname"] = authorItem$lname
    author[authorId,"fname"] = authorItem$fname
    author[authorId,"initial"] = authorItem$initial
    author[authorId,"affiliation"] = authorItem$affiliation
    authorItem$id <- authorId
    authorId <- authorId + 1
  } else{
    authorItem$id <- author$id[authorRow]
  }
}

# ===== <ArticleAuthorMapping> =====

```

```

    articleAuthorMapping[artAuthorMappingId,"id"] = artAuthorMappingId
    articleAuthorMapping[artAuthorMappingId,"article_id"] = articleItem$id
    articleAuthorMapping[artAuthorMappingId,"author_id"] = authorItem$id
    artAuthorMappingId <- artAuthorMappingId + 1

}

# ===== <History> =====
historyList <- xmlChildren(pubmedArticle[["PubmedData"]][["History"]])

for(historyItem in historyList){
  historyItem <- parseHistory(
    historyItem
  )

  history[historyId,"id"] = historyId
  history[historyId,"date_time"] = historyItem$date_time
  history[historyId,"type"] = historyItem$type
  history[historyId,"article_id"] = articleItem$id
  historyId <- historyId + 1

  # fixing the pub_date if it was empty in journal issue
  if(str_length(journalIssueItem$pub_date) == 0 && grepl("publish",historyItem$type)){
    journalIssueItem$pub_date = toString(as.Date(historyItem$date_time,"%Y-%m-%d"))
    journalIssue$pub_date[journalIssueId - 1] = journalIssueItem$pub_date
  }

  if(str_length(articleItem$pub_date) == 0 && grepl("entrez",historyItem$type)){
    articleItem$pub_date = toString(as.Date(historyItem$date_time,"%Y-%m-%d"))
    article$pub_date[articleItem$id] = articleItem$pub_date
  }
}
}
}

```

# Database

## Creating a connection

```
# Connecting to Database

#Connection setting
db_user <- 'sudo'
db_password <- 'dbmsp2neu'
db_name <- 'med_db'
db_host <- 'db-practicum-2.cfm4y0dsbhpu.us-east-2.rds.amazonaws.com'
db_port <- 3306

#Connect to the DB
dbcon <- dbConnect(MySQL(), user = db_user, password = db_password, dbname = db_name, host = db_
host, port = db_port)
```

## Creating OLTP Database

```
DROP TABLE IF EXISTS history,article_author_mapping,article,author,journal,journal_issue;
```

```
CREATE TABLE author (
  id INTEGER NOT NULL,
  fname text,
  lname text NOT NULL,
  initial text,
  affiliation text,
  PRIMARY KEY (id)
);
```

```
CREATE TABLE journal (
  id INTEGER NOT NULL,
  title TEXT,
  issn INTEGER,
  PRIMARY KEY (id)
);
```

```
CREATE TABLE journal_issue (
  id INTEGER NOT NULL,
  volume INTEGER,
  issue INTEGER,
  pub_date DATE NOT NULL,
  journal_id INTEGER,
  PRIMARY KEY (id),
CONSTRAINT journal_id_fk_journalissue FOREIGN KEY ( journal_id) REFERENCES journal (id)
);
```

```
CREATE TABLE article (  
  id INTEGER NOT NULL,  
  title TEXT NOT NULL,  
  pub_date DATE ,  
  journal_issue_id INTEGER NOT NULL,  
  pub_model VARCHAR(100),  
  PRIMARY KEY (id),  
  CONSTRAINT journal_issue_id_fk FOREIGN KEY (journal_issue_id) REFERENCES journal_issue (id)  
);
```

```
CREATE TABLE history (  
  id INTEGER NOT NULL,  
  date_time DATETIME NOT NULL,  
  type TEXT NOT NULL,  
  article_id INTEGER NOT NULL,  
  PRIMARY KEY (id),  
  CONSTRAINT article_id_fk FOREIGN KEY (article_id) REFERENCES article (id)  
);
```

```
CREATE TABLE article_author_mapping (  
  id INTEGER NOT NULL,  
  article_id INTEGER NOT NULL,  
  author_id INTEGER NOT NULL,  
  PRIMARY KEY (id),  
  CONSTRAINT article_id_fk_mapping FOREIGN KEY (article_id) REFERENCES article (id),  
  CONSTRAINT author_id_fk FOREIGN KEY (author_id) REFERENCES author (id)  
);
```

## Inserting into the db

```
insertIntoTable("journal", journal)
```

```
## Warning in split.default(x = seq_len(nrow(x)), f = f, drop = drop, ...): data  
## length is not a multiple of split variable
```

```
insertIntoTable("author", author)
```

```
## Warning in split.default(x = seq_len(nrow(x)), f = f, drop = drop, ...): data  
## length is not a multiple of split variable
```

```
insertIntoTable("journal_issue", journalIssue)
```

```
## Warning in split.default(x = seq_len(nrow(x)), f = f, drop = drop, ...): data  
## length is not a multiple of split variable
```

```
insertIntoTable("article", article)
```

```
## Warning in split.default(x = seq_len(nrow(x)), f = f, drop = drop, ...): data
## length is not a multiple of split variable
```

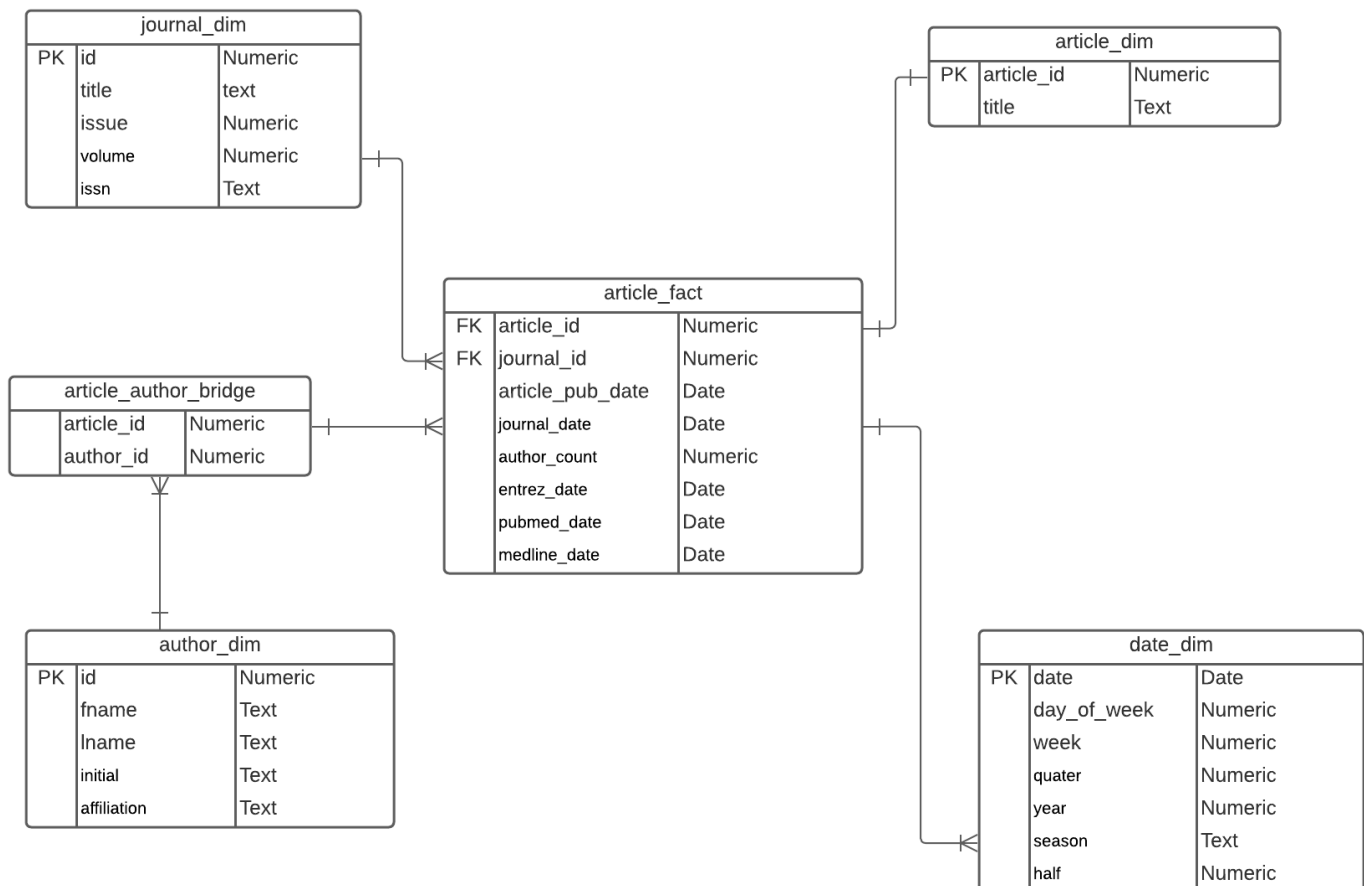
```
insertIntoTable("history", history)
```

```
## Warning in split.default(x = seq_len(nrow(x)), f = f, drop = drop, ...): data
## length is not a multiple of split variable
```

```
insertIntoTable("article_author_mapping", articleAuthorMapping)
```

```
## Warning in split.default(x = seq_len(nrow(x)), f = f, drop = drop, ...): data
## length is not a multiple of split variable
```

## Part 2. ERD showing OLAP schema



## Creating OLAP Schema

```
DROP SCHEMA IF EXISTS pubmed_starschema
```

```
CREATE SCHEMA pubmed_starschema
```

## Creating required tables

```
DROP TABLE IF EXISTS pubmed_starschema.article_author_bridge, pubmed_starschema.article_dim, pubmed_starschema.article_fact, pubmed_starschema.author_dim, pubmed_starschema.date_dim, pubmed_starschema.journal_dim;
```

```
CREATE TABLE pubmed_starschema.journal_dim AS
SELECT
    ji.id AS 'id',
    j.title AS 'title',
    ji.issue AS 'issue',
    ji.volume AS 'volume',
    j.issn AS 'issn'
FROM journal_issue ji
    INNER JOIN journal j
        ON ji.journal_id = j.id
ORDER BY ji.id
```

```
CREATE TABLE pubmed_starschema.author_dim AS
SELECT *
FROM author
ORDER BY author.id;
```

```
CREATE TABLE pubmed_starschema.article_dim AS
SELECT
    a.id AS id,
    a.title AS title
FROM article a
ORDER BY id;
```

```
CREATE TABLE pubmed_starschema.article_author_bridge AS
SELECT
    a.article_id,
    a.author_id
FROM article_author_mapping a
ORDER BY a.id
```

```

CREATE TABLE pubmed_starschema.date_dim AS
SELECT
    DATE(a.pub_date) AS 'date',
    DAYOFWEEK(a.pub_date) AS day_of_week,
    WEEK(a.pub_date) AS 'week',
    QUARTER(a.pub_date) AS 'quarter',
    CASE WHEN QUARTER(a.pub_date) <3 THEN 1 ELSE 2 END AS 'half',
    YEAR(a.pub_date) AS 'year',
    CASE
        WHEN MONTH(a.pub_date) >= 3 AND MONTH(a.pub_date) <= 6
            THEN 'FALL'
        WHEN MONTH(a.pub_date) >= 7 AND MONTH(a.pub_date) <= 9
            THEN 'WINTER'
        WHEN MONTH(a.pub_date) >= 10 AND MONTH(a.pub_date) <= 12
            THEN 'SPRING'
        WHEN MONTH(a.pub_date) >= 1 AND MONTH(a.pub_date) <= 2
            THEN 'SUMMER'
    END AS season
FROM article a
UNION
SELECT
    DATE(h.date_time) AS 'date',
    DAYOFWEEK(h.date_time) AS day_of_week,
    WEEK(h.date_time) AS 'week',
    QUARTER(h.date_time) AS 'quarter',
    CASE WHEN QUARTER(h.date_time) <3 THEN 1 ELSE 2 END AS 'half',
    YEAR(h.date_time) AS 'year',
    CASE
        WHEN MONTH(h.date_time) >= 3 AND MONTH(h.date_time) <= 6
            THEN 'FALL'
        WHEN MONTH(h.date_time) >= 7 AND MONTH(h.date_time) <= 9
            THEN 'WINTER'
        WHEN MONTH(h.date_time) >= 10 AND MONTH(h.date_time) <= 12
            THEN 'SPRING'
        WHEN MONTH(h.date_time) >= 1 AND MONTH(h.date_time) <= 2
            THEN 'SUMMER'
    END AS season
FROM history h
UNION
SELECT
    DATE(ji.pub_date) AS 'date',
    DAYOFWEEK(ji.pub_date) AS day_of_week,
    WEEK(ji.pub_date) AS 'week',
    QUARTER(ji.pub_date) AS 'quarter',
    CASE WHEN QUARTER(ji.pub_date) <3 THEN 1 ELSE 2 END AS 'half',
    YEAR(ji.pub_date) AS 'year',
    CASE
        WHEN MONTH(ji.pub_date) >= 3 AND MONTH(ji.pub_date) <= 6
            THEN 'FALL'
        WHEN MONTH(ji.pub_date) >= 7 AND MONTH(ji.pub_date) <= 9
            THEN 'WINTER'
        WHEN MONTH(ji.pub_date) >= 10 AND MONTH(ji.pub_date) <= 12

```



```

        THEN 'SPRING'
    WHEN MONTH(ji.pub_date) >= 1 AND MONTH(ji.pub_date) <= 2
        THEN 'SUMMER'
    END AS season
FROM journal_issue ji

```

```

CREATE TABLE pubmed_starschema.article_fact AS
SELECT
    a.id as article_id,
    ji.id as journal_id,
    a.pub_date as article_pub_date,
    ji.pub_date as journal_issue_date,
    hisEntrez.date_time as entrez_date,
    hisPubmed.date_time as pubmed_date,
    hisMedline.date_time as medline_date
FROM article a
    inner join journal_issue ji on a.journal_issue_id = ji.id
    inner join journal j on j.id = ji.journal_id
    left join history hisEntrez on hisEntrez.article_id = a.id AND hisEntrez.type like 'entrez'
    left join history hisPubmed on hisPubmed.article_id = a.id AND hisPubmed.type like 'pubmed'
    left join history hisMedline on hisMedline.article_id = a.id AND hisMedline.type like 'medline'
    order by a.id asc

```

## Creating summary fact table 1

Creating a summary fact table that shows the number of articles published by an author for each quarter of a given year.

```

create table pubmed_starschema.articles_published_by_author_by_time as
select
    (a.id) as author_id,
    count(af.article_pub_date) as publication_count,
    d.quarter,d.year
from pubmed_starschema.author_dim a
left join pubmed_starschema.article_author_bridge bridge on a.id = bridge.author_id
left join pubmed_starschema.article_fact af on af.article_id = bridge.article_id
left join pubmed_starschema.date_dim d on d.date = af.article_pub_date
group by d.quarter,d.year,a.id
order by year, quarter;

```

## Creating summary fact table 2

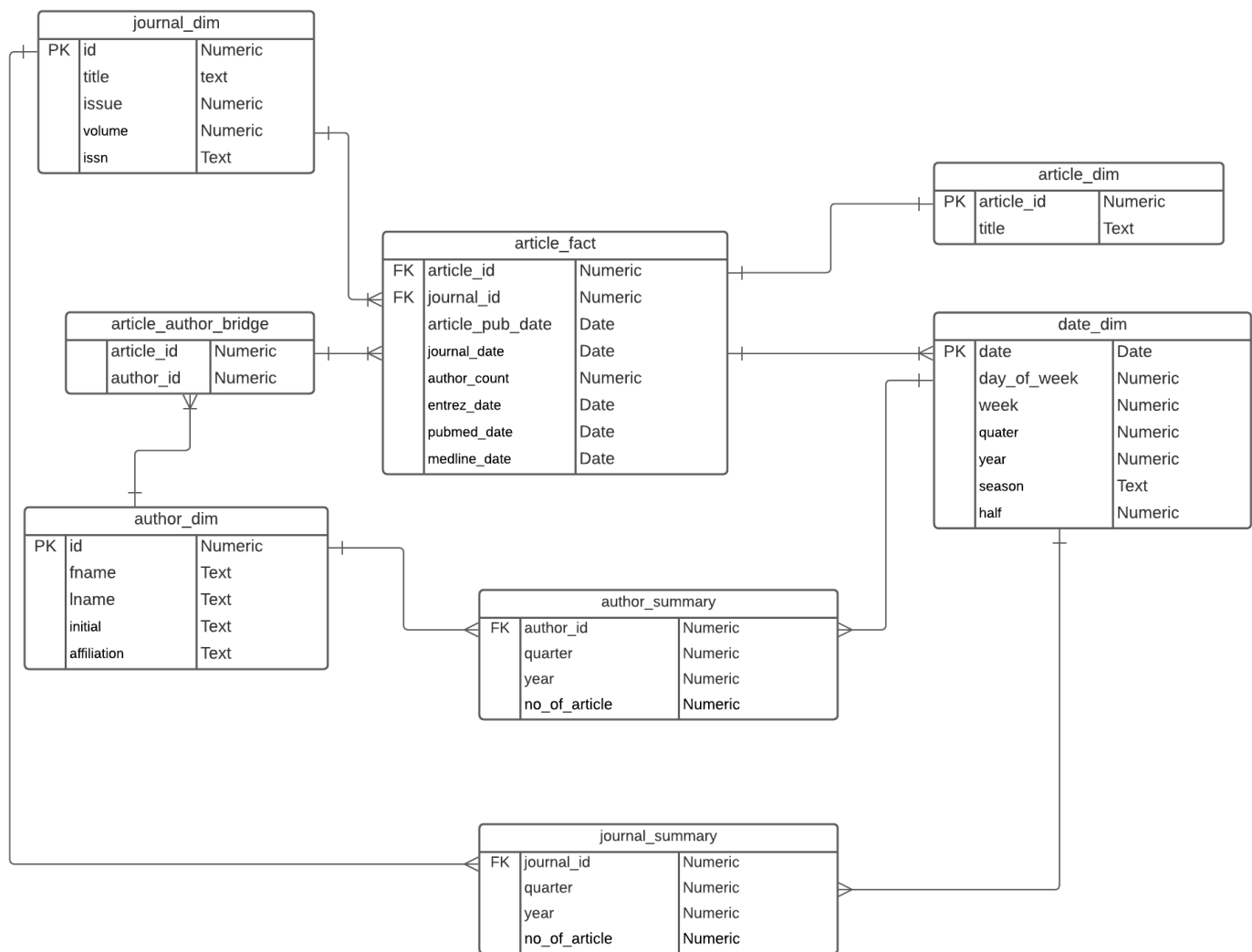
Creating a summary fact table that shows the number of articles published by a journal for each quarter of a given year.

```

create table pubmed_starschema.articles_published_by_journal_by_time as
SELECT jd.id as journal_id,
       quarter,
       year,
       count(af.article_id) as no_of_article
FROM pubmed_starschema.journal_dim as jd
LEFT JOIN pubmed_starschema.article_fact as af
  ON (jd.id = af.journal_id)
LEFT JOIN pubmed_starschema.date_dim as dd
  ON (dd.date = af.article_pub_date)
GROUP BY dd.quarter, dd.year, jd.title;

```

## Part 3. ERD showing OLAP schema with summary fact tables



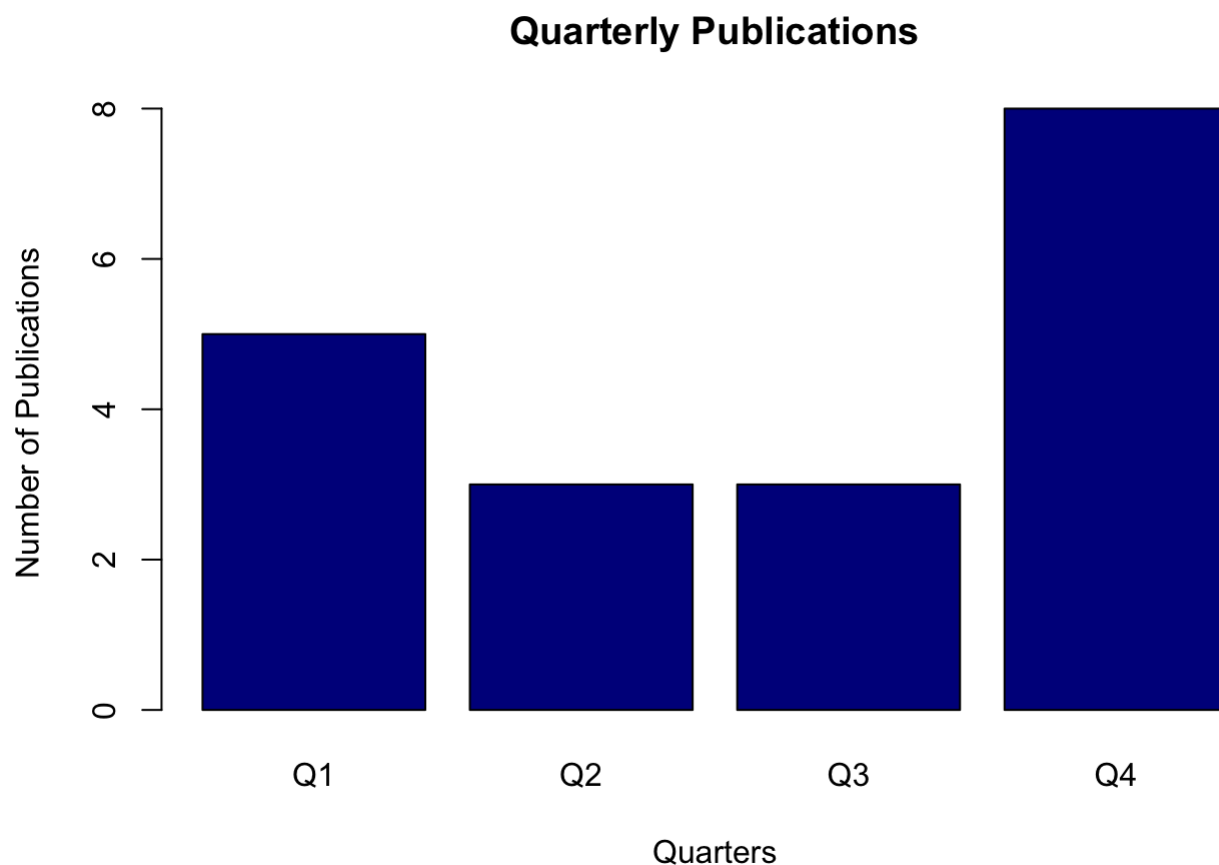
## Q1 - 3 graphs example

We have implemented 3 queries for this question.

Plots a graph showing a relation between the number of publications for each quarter of the year.

```
d <- dbGetQuery(dbcon,"SELECT concat('Q',dd.quarter) as quarter,
      COUNT(af.article_pub_date) as publications
FROM pubmed_starschema.article_fact as af
LEFT JOIN pubmed_starschema.date_dim as dd
  ON af.article_pub_date = dd.date
GROUP BY dd.quarter order by dd.quarter;")
counts <- table(d$publications,d$quarter)

barplot(d$publications,main="Quarterly Publications",xlab="Quarters",ylab="Number of Publications",
  names.arg=d$quarter, col=c("darkblue"))
```

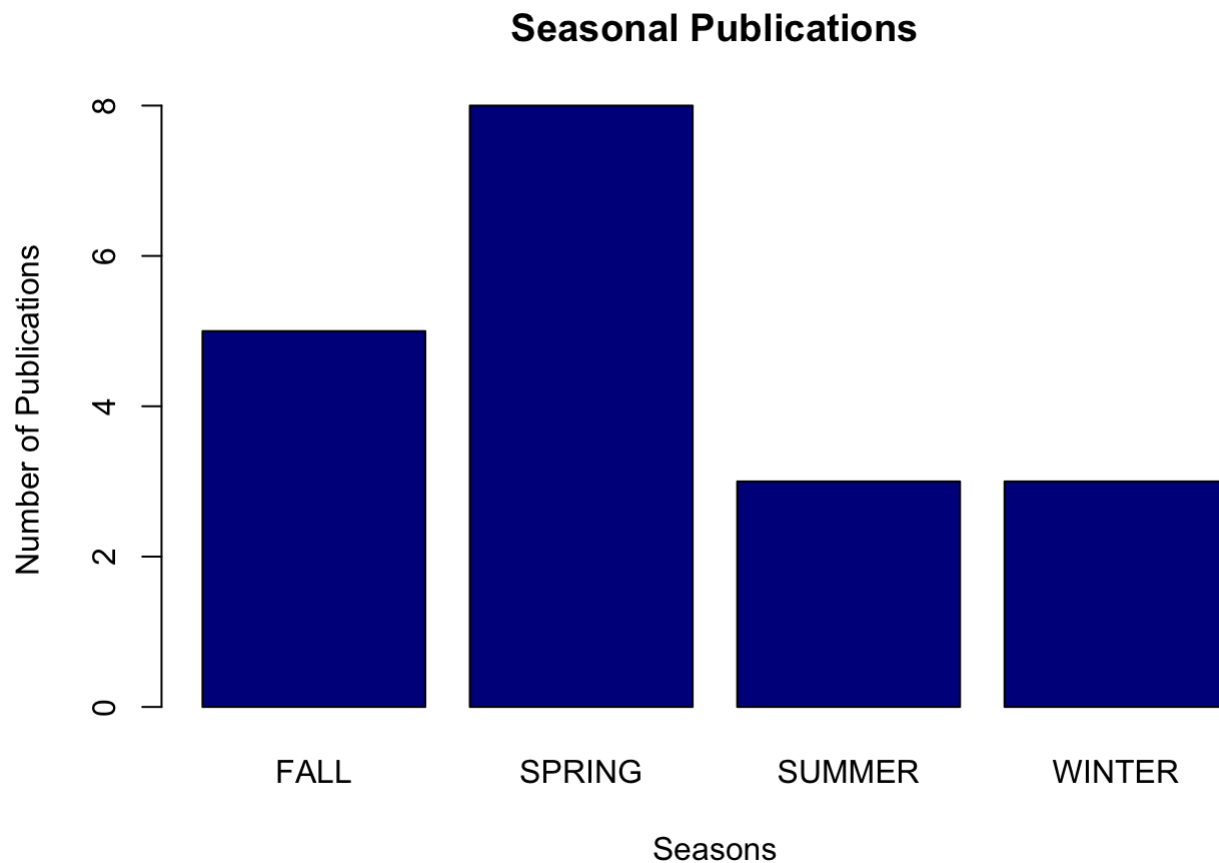


Plots a graph showing a seasonal pattern between the number of publications and the seasons of a year.

```
d <- dbGetQuery(dbcon,"SELECT dd.season,
      COUNT(af.article_pub_date) as publications
FROM pubmed_starschema.article_fact as af
LEFT JOIN pubmed_starschema.date_dim as dd
      ON af.article_pub_date = dd.date
GROUP BY dd.season ORDER BY season;")

counts <- table(d$publications,d$season)

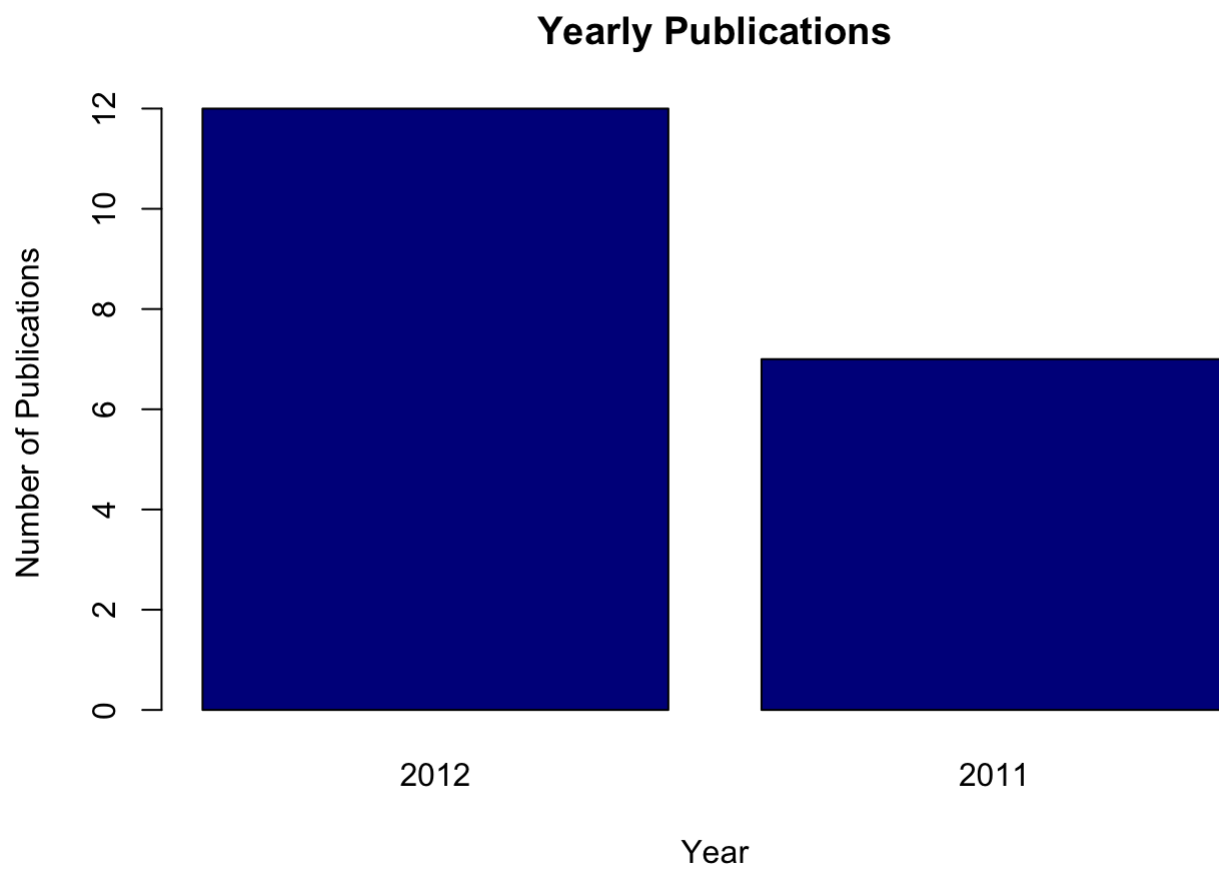
barplot(d$publications,main="Seasonal Publications",xlab="Seasons",ylab="Number of Publications"
, names.arg=d$season, col=c("darkblue"))
```



Plots a graph showing the number of publications for each year.

```
d <- dbGetQuery(dbcon,"SELECT dd.year as month,COUNT(af.article_pub_date) as publications
FROM pubmed_starschema.article_fact as af
LEFT JOIN pubmed_starschema.date_dim as dd
      ON af.article_pub_date = dd.date
GROUP BY dd.year;")

barplot(d$publications,main="Yearly Publications",xlab="Year",ylab="Number of Publications", names.arg=d$month, col=c("darkblue"))
```



```
# Disconnect the database  
dbDisconnect(dbcon)
```

```
## [1] TRUE
```