How to install and use Opal and DataSHIELD for data harmonisation and federated data analysis

1 Setting up an Opal and an R server

This section explains in details how to install and configure both Opal, R and a database application.

Opal will be used as the core data warehouse in your installation. Opal provides all the necessary tools to import, transform and describe data. Note that Opal is not a database: Opal needs to connect to a database application to store its data.

R provides a software environment for statistical computing and graphics. R will be used as a server: Opal will connect to this server to control remote accesses, push data to be analysed and retrieve results.

The instructions given assume that Opal, R and the database servers will be deployed on **Ubuntu 14.04 LTS**. These applications can also be installed on other Debian-like Linux distributions (Debian 7 for instance). Packages for Fedora-like Linux distributions (Fedora, CentOS 6 or 7) are also available: alternative installation instructions for these systems are provided as reference to the relevant installation guides.

Most of the following instructions and related information are taken from <u>Opal Server Administrator Guide</u>. Please refer to this online documentation for updated information.

1.1 Hardware Requirements

Although it is possible to install Opal, R and the database applications on different machines, this documentation assumes that these different software will be installed on the same host. As a consequence the hardware requirements must satisfy the combination of these three applications.

Component	Requirement
CPU	Recent server-grade or high-end consumer-grade processor
Memory (RAM)	8GB required, >= 16GB recommended
Disk space	5GB of free disk space required*

^{*} The required disk space varies in function of the number of participants (and variables) in the datasets. Please use the following "rule of thumb" to evaluate your needs: 1 GB for the software + 4 GB/10000 participants.

Note that R is a single-threaded application and having CPUs with multi-cores will not make R computations faster: the performance of a single CPU core should be as good as possible.

Note also that R works in memory, then make sure the server has enough RAM for satisfying R needs without affecting too much the other applications. The recommended RAM size then should be adjusted depending on the size of the datasets and the type of statistical analysis that will be conducted (and the number of researchers running analysis simultaneously).

1.2 Installing Opal Server

This section is about installing both Opal and an associated database application.

1.1.1 Software Requirements

The following softwares must be installed on your server before you install Opal.

Note: At least one database management system must be installed. It can be either <u>MongoDB</u>, <u>MySQL</u> or both. Unless you have specific needs or constraints, MongoDB is recommended.

Software	Suggested Version	Use	Installation/Configuration
Java Runtime Environment	JRE 8.x	Java runtime environment - needed to run Opal	JRE 8 Ubuntu Installation Guide
MySQL	>= 5.5.x	Database management system - stores data imported into Opal	MySQL Database Configuration
MongoDB	>= 2.6.x	Database management system - stores data imported into Opal	MongoDB Database Configuration

1.1.1.1 Installation of Java

Using apt, you can install Java 8 via the following sequence of commands:

```
sudo add-apt-repository ppa:webupd8team/java
sudo apt-get update
sudo apt-get install oracle-java8-installer
```

Alternatively download Oracle Java RPM package.

1.1.1.2 Installation of the Database

One database server is required for Opal server to be able to operate. It is your choice to install MySQL or MongoDB. Due to the data schema used by Opal for storing data in the database, MongoDB is known to be better for large datasets.

1.1.1.2.1 MongoDB installation [recommended]

MongoDB is the recommended database engine.

See detailed MongoDB Ubuntu Installation Guide that can be summarized as follow:

```
sudo apt-key adv --keyserver hkp://keyserver.ubuntu.com:80 --recv 7F0CEB10
echo 'deb http://repo.mongodb.org/apt/ubuntu trusty/mongodb-org/3.0
multiverse' \
    | sudo tee /etc/apt/sources.list.d/mongodb.list
sudo apt-get update
sudo apt-get install -y mongodb-org
```

Alternatively see MongoDB RedHat/CentOS Installation Guide.

1.1.1.2.2 Installation of MySQL

MySQL database server can be installed using the following apt command:

```
sudo apt-get install mysql-server
```

Alternatively see MySQL RPM Repository instructions.

Finalise the installation by following the recommended MySQL server configuration.

1.1.2 Installation of Opal

Latest Opal server installation recommendations are available online in the Opal Installation Guide.

Once installed the Opal server is up and running (though not fully configured).

Prerequisite: The package apt-transport-https is required for OBiBa's repository communicate through HTTPS. If you don't have it installed on your system, install it via:

```
sudo apt-get install apt-transport-https
```

Then run the following commands to register the OBiBa Debian packages repository where Opal and other tools lies and install Opal server:

Alternatively see OBiBa RPM repository instructions.

1.1.3 Configuration, Administration and Execution of Opal

Options for the Java Virtual Machine

Default configuration of Opal is usually not suitable for a production server. More specifically, the Opal application is allocated a maximum of 2G of RAM by default which could be not enough for operating on large datasets.

To increase the allocated memory edit the file /etc/default/opal and modify the value of JAVA_ARGS accordingly: -Xmx argument is to be changed for a higher value (at least 4G).

Then restart Opal server for making the new settings effective:

```
sudo service opal restart
```

Opal service log files

For troubleshooting, the log files to be inspected are located in /var/log/opal directory.

Opal offers many configuration possibilities (see Opal documentation for more details):

- Some are file-based (located in the folder /etc/opal)
- Others are accessible from the web application interface (located at https://<host>:8443)

1.2 Installing R Server

The R server consists of several pieces of software:

- R, is the R language interpreter,
- Rserve, is an R package that allows to start an R session from a distant connection,
- R Server Admin, is a Java-based application that allows to start and stop Rserve from a distant connection.

Latest R server installation recommendations are available online in the R Server Installation Guide.

1.2.1 Software Requirements

Software	Suggested Version	Use	Installation/Configuration
Java Runtime Environment	JRE 8.x	Java runtime environment - needed to run R Server Admin	JRE 8 Ubuntu Installation Guide
R	>= 3.1.x	Statistical analysis engine	http://cran.r-project.org

1.2.2 Installation of R Server

A Debian package is provided to conveniently install all the softwares required to build an R server that is ready to be used by Opal.

The default R provided by the Linux distribution is not the latest one: the R Debian repository is to be added first.

```
sudo apt-key adv --keyserver keyserver.ubuntu.com --recv-keys E084DAB9
echo 'deb https://cran.rstudio.com/bin/linux/ubuntu trusty/' \
   | sudo tee /etc/apt/sources.list.d/cran.list
sudo apt-get update
```

Then the R server installation is performed using the following commands:

```
sudo apt-get install opal-rserver
sudo service rserver restart
```

Once done, the R server should be up and running. Default settings are usually enough for Opal to connect to this server.

Alternatively see <u>CRAN RPM repository</u> and <u>OBiBa RPM repository</u> instructions.

1.3 Security Configuration

Several servers are running on your system, but only a limited number of services should be exposed. The communication to these services must be encrypted and can be restricted to a limited set of clients.

The following firewall rules must be applied:

- 1. Allow HTTPS connections to Opal through the port 8443 (this port number can be configured; a reverse proxy can also be setup),
- 2. Allow SFTP connections to Opal through the port 8022 (this firewall rule is optional, as file upload can also be performed through HTTPS),
- 3. Allow a limited set of external IP addresses to connect to the host (typically for the DataSHIELD analysis server (see below) and administrators).

The other services (R and database servers) must not be exposed. Opal server will access them locally.

Advanced security setting that can be considered is to restrict the supported encryption protocols and algorithms used by Opal server when communicating through HTTPS. This can be achieved at Opal and/or Java levels. See Opal server documentation for more details.

2 Infrastructure Testing

This section are instructions for cohorts to set up a test dataset on their server that we can test against.

The tests you will perform on Opal are guite simple:

1. You will upload a test dataset in Opal. This will ensure that Opal is correctly configured, that it is properly connected to its database, and that it can be administered through its web interface.

2. You will make some calculations on this dataset from a distant computer. These calculations will be made using R, and success of this testing will guarantee that R Server Admin is properly installed.

2.1 Getting the Test Dataset

The test dataset (generated data) to be downloaded is LifeLines.sav.

2.2 Setup the Data for Testing

Opal's administrative web interface can be accessed with any modern web browser by pointing it to:

https://<host>:8443

where <host> is the IP address or the host name where Opal is located on the network.

2.2.1 Configuring the Databases

Before proceeding, Opal storage databases have to be configured. If you already done this, go to step 2.2.2.

Otherwise, for being fully operational, Opal requires to register two databases (that can be located in the same database server): one for the participant identifiers and one for their data.

First, prepare the databases in the database server:

- one with name opal ids,
- one with name opal data.

Create a user with administrator privileges on these databases. See <u>MongoDB</u> <u>Database</u> <u>Creation</u> or <u>MySQL</u> <u>Database</u> <u>Creation</u> instructions for more details.

Then databases registration is done as follow:

- 1. Login as an administrator in Opal web interface,
- 2. A "Post-Install Configuration" page is displayed allowing to set up the Opal databases,
- 3. In the "Identifiers Database" section, click on "Register" and select the database type of your choice ("SQL" or "MongoDB").
- 4. Input information for the database: provide the name of the database along with connection information (url, username and password) and save the settings.
- 5. Do the same for the "Data Databases" (the database url must be different from the one for the identifiers).

2.2.2 Uploading data for testing

Some test data will be imported from a file. This file needs to be accessible from the Opal server. For that purpose, Opal has a "file system" where the data files can be uploaded.

From the "Dashboard" page, click on "Manage Files":

1. Navigate to the directory where the data file will be uploaded.

- 2. Click on the "Upload" button; this will open a "File Upload" window which allows you to select a file to upload from your computer.
- 3. Click on "Choose File" and select the LifeLines.sav file you have saved at section 2.1. Once done, click on the "Upload" button.

Since LifeLines.sav is an SPSS file, it includes both the data dictionary (i.e. variable coding and labels) and the participant data.

2.2.3 Create a Project and Import Data

In Opal, a project is the workspace for managing data. It is required to create a project before importing data into Opal.

- 1. Go to the "Projects" page.
- 2. Add a Project by clicking on the "Add Project" button. Then, in the "Add Project" popup window,
 - a. Enter test in the name field,
 - b. Select the database you created in step 2.2.1 as the project's data store,
 - c. Save the project.

Then import data into this project.

- 1. Go to the test project page, tables section,
- 2. Click on the "Import" button to open the "Import Data" window.
- 3. For the "Data Format" drop-down, select "SPSS" option and click on the "Next" button.
- 4. Under "Data File", click "Browse" to select (tick) the LifeLines.sav file, then click on "Select".
- 5. Click on the "Next" button so that you skip the "Configure data import" step.
- 6. Tick the checkbox to the left of the LifeLines table and click on the "Next" button.
- 7. You can review the data for the table LifeLines to be imported, then click on the "Next" button.
- 8. Keep the default setting for data file archiving and click on the "Finish" button.

You can follow the import task progress by going to the *tasks* section of the project page. Once importation is completed successfully, the LifeLines table should appear in the *tables* section of the project page.

2.3 Test the R Server with Test Data

You will use the data you imported in the previous section in order to test whether the R Server is correctly installed and works correctly with Opal.

From the shell prompt of the server, start the R console:

```
R
```

The following R script should be executed without errors (make sure to change in this script the administrator's password with the one of your server):

```
# Load Opal R library
require('opal')
```

```
# Then, create an opal object with the login information
# Change the login credentials and url with the appropriate values!
o <- opal.login(username='administrator', password='password',
url='https://localhost:8443')

# To verify if the connexion with Opal works,
# get the list of all projects
opal.datasources(o)

# Assign the content of the LifeLines table (from the test project)
# into a data frame in a R session of the R server
opal.assign(o,'D','test.LifeLines', missings = TRUE)

# Get the summary of this data frame from the remote R session
opal.execute(o,'summary(D)')

# Terminate the remote R session
opal.logout(o)</pre>
```

The expected output result from the data frame summary command is:

```
GESLACHT GEWICHT LENGTE HEALTH17A1 HEALTH17B1 HEALTH17D1
1:2551 Min. : 31.00 Min. :144.2 1: 425 1: 0 1:4666
2:2473  1st Qu.: 66.94  1st Qu.:172.2  2:4599
                                         2:5024
                                                 2: 0
                                        3: 0 3: 150
4: 0 4: 208
      Median: 76.08 Median: 178.5
      Mean : 76.20 Mean :178.6
      3rd Qu.: 85.42 3rd Qu.:184.9
                                                 5: 0
      Max. :130.68 Max. :210.5
            SMK11 SMK31 SMK4A1 SMK4A21
   DBPa
Min. : 39.00 1: 997 1: 811 Min. : 0.000 1: 708
1st Qu.: 71.00 2:4027 2:4213 1st Qu.: 0.000 2: 58
                          Median: 2.000 3:4258
Median : 80.00
Mean : 79.78
                          Mean : 3.915
3rd Qu.: 88.00
                          3rd Qu.: 7.000
Max. :126.00
                          Max. :24.000
```

3 Install DataSHIELD for Federated Analysis

DataSHIELD is the platform that allows federated analysis to be carried out on your data. We assume in this section there is an existing Federated Database Network (**FDN**) with a central DataSHIELD analysis server. This section explains how to set up DataSHIELD on your data server and to connect this server to the existing FDN.

3.1 Install DataSHIELD packages

Each server in the network must be configured the same way so that same computation is done in each Opal for one client request. This is done by using the DataSHIELD-R packages repository.

To install these packages, follow these steps:

- 1. Go to the "Administration" page, and click on "DataSHIELD" section.
- 2. Click on "Add Package".
- 3. Leave the default option: "Install all DataSHIELD packages" and click "Install"
- 4. The DataSHIELD packages should appear in the list and the Methods section should also be populated with entries.

3.2 Create a user

Now we need to create a user account for the analysis server to be able to run a test analysis against your server:

- 1. Go to the "Administration" page, and click on "Users and Groups" section.
- 2. Click on "Add User".
- 3. Select "Add user with certificate".
- 4. Give the user the name "FDN_user" (usually this username is provided by the project administrator and reflects the name of the FDN your server has to connect to)
- 5. Ask the project administrator for the analysis server's certificate
- 6. Paste the following certificate into the box and click "Save"

3.3 Set DataSHIELD Permissions

The FDN user must be given permission to access the server using DataSHIELD.

- 1. Go to the "Administration" page, and click on "DataSHIELD" section.
- 2. Scroll down the page and Click on "Add Permission".
- 3. Select "Add user permission".
- 4. Type "FDN user" in the name field.
- 5. Leave the default selection of "Use" and click on "Save".

3.4 Set Project Permissions

Now it is necessary to set up the permissions for the user on the LifeLines table in the test project.

- 1. Go to the "Projects" page and click on the test project.
- 2. Go to the tables section and click on the LifeLines table.
- 3. Click on the "Permissions" tab.
- 4. Click on "Add Permission".
- 5. Select "Add user permission".
- 6. Type "FDN user" in the name field.
- 7. Leave the default value of "View dictionary and summaries" and click on "Save".

3.5 Test the Functionality

Contact the project technical support who will check that they can run a summary analysis on the test dataset.

4. Transfer Study-specific Data into Opal

Do not complete this section until it has been agreed which variables will be required for the research question that the consortium is addressing.

4.1 Prepare Study-specific Datasets to be Imported into Opal

4.1.1 Ensure the Datasets include needed information

4.1.1.1 Select Study-specific Variables

For each study, a list of study-specific variables will be selected based on the mapping protocol developed by the harmonization working group. The mapping protocol includes all study-specific variables required to generate the Dataschema variables (common core variables to be generated for the harmonized dataset).

4.1.1.2 Create new Dataset

The local team should develop a new dataset with the required variables and data. The naming of the dataset should indicate the study and data collection event it belongs to (e.g. baseline, wave 1, etc...). Each variable should include a name, clear label, and category codes and labels.

4.1.2 Manage Data Inconsistencies and Create Clean Datasets

4.1.2.1 Run Descriptive Statistics

Data distribution and variables' associations should be tested to ensure data quality. Data should be checked for odd distributions (e.g. 92% missing values for income), impossible ranges (e.g. sleeping more than 24 hours per day), and contradictory values (e.g. age of onset of diabetes is higher than the actual age of participant). The data should also conform to the questionnaire flow taking into consideration all skip patterns.

4.1.2.2 Manage Problematic Values and Document Decisions

Management of the problematic values is context specific. It is recommended that a local group reviews each case and recommends solution strategies. All data cleaning decisions should be transparent and well documented to be provided to the harmonization working group.

4.2 Import Study-specific Datasets into Opal

You will now import study-specific datasets into Opal. The procedure is akin to the one you did in **2.2.2** — **2.2.3** for the test dataset.

4.2.1 Datasource Type

While there are more than two different types of datasource, you will deal here only with the two you are likely to use for variable and data import namely:

- **CSV** is a "delimiter separated values" text file format. First row are the variable names, subsequent rows are the participant values. First column is expected to be the participant identifier. A CSV file can be imported as-is but the variables will be considered as being of *text* type, unless the data dictionary is prepared before the data import (as explained in the **4.3** section).
- SPSS source file must be a valid non-compressed binary file with a .sav extension. In Opal an SPSS file represents a table and its variables are used as the table's data dictionary. An Opal compatible SPSS file must have its first variable represent the identifiers. If this is not the case, before a file import, the identifier variable must be moved to the first position of the SPSS variable sheet.

For more information about the available file based formats, see Opal Datasource Types documentation.

4.2.2 Importing the Data

This is exactly as done in **2.2.2** - **2.2.3** except for the obvious variations: the name of the project, the format of the data file you are importing (either SPSS .sav files or CSV .csv files), and the path to the file.

4.3 Prepare Data Dictionary

Detailed information for each variable should be documented in a structured way to enhance comprehension and highlight existing heterogeneity across different studies. Required information for each study variable is presented in table 1. Data dictionary information can be updated directly in Opal or in Excel.

Table 1: Information to be documented for each study-specific variable

Field	Definition	
Table	Name of the dataset the variable is associated with	
Variable name	Name of the variable	
Label	Short description of the variable specifying its content (e.g. <i>Type of diabetes</i>) Further information can be added in the <i>description</i> field.	
Description	Additional information about the variable such as: • For variables collected by questionnaire, the question itself or any relevant information about the variable (e.g. Have you ever been told by a doctor that you had diabetes?)	

	 For variables about physical/laboratory measures, any relevant information describing the context of measurement (e.g. self-reported measure, measure by a trained professional) or related to the protocol (e.g. measure taken when the participant is at rest) For derived or constructed variables, any relevant information about the derivation or construction of the variable (e.g. MMSE total score, total energy in Kcal per day derived from diet questionnaire)
Value type	Type of variable: Decimal (numerical values with a fractional component) Integer (numerical values without a fractional component) Text (alphanumerical values) Date (values written in a defined date format) Datetime (values written in a defined date and time format) Boolean (two possible values (usually denoted true or false)) (e.g. Type of diabetes has an integer value type: 1, 2, 3, 8, 9)
Unit	Measurement unit of the variable (e.g. cm, mmol/L)
	Additional information for categories
Category code	Value assigned to each variable category (e.g. Type of diabetes has 5 categories: 1, 2, 3, 8, 9)
Category label	Short description of the category (e.g.: 1: Type 1 diabetes 2: Type 2 diabetes 3: Gestational diabetes 8: Prefers not to answer 9: Missing
Missing	Code assigned to each category identifying it as a missing value (e.g.: 1: Type 1 diabetes (Not missing = 0) 2: Type 2 diabetes (Not missing = 0) 3: Gestational diabetes (Not missing = 0) 8: Prefers not to answer (Missing = 1) 9: Missing (Missing = 1))

4.3.1 Updating Data Dictionary in Opal

Adding data dictionary information such as label, description and categories or changing value type of a variable can be done directly in Opal by following the steps below:

- 1. Go to the project page, *tables* section,
- 2. Go to the table page, then add a new variable or go to the variable page to be modified,
- 3. Edit variable properties (note that the value type cannot be modified if the table has data),
- 4. Edit the categories (add, update or remove categories),
- 5. Edit the attributes (label, description...).

4.3.2 Updating Data Dictionary from Excel

Data dictionary information can also be updated from an Excel file. This can be achieved by first downloading the excel data dictionary, then changing the information and finally uploading it in Opal. This method is usually more efficient when dealing with a large number of variables. Below are the steps:

- 1. Go to the project page, tables section,
- 2. Go to the table page,
- 3. Click on "Download" and select "Download dictionary",
- 4. Open the downloaded Excel file:
 - In the "Variables" sheet, there is one row per variable and one column per property/attribute,
 - o In the "Categories" sheet, there is one row per variable's category.
- 5. Modify the information of the Excel file: do not modify the column names, make sure there are no duplication of variable/category rows and note that the value type cannot be modified if the table has data.
- 6. Update the table data dictionary with this Excel file:
 - o Go to the project page, tables section,
 - o Click on "Add Table" and select "Add/update tables from dictionary",
 - o Select the the Excel file (you need to upload it into Opal first), and click "Next",
 - o Review the changes, select the table to be added or updated, and click "Finish".

5. Harmonisation and Federated Analysis

This section describes the steps that are necessary to implement harmonisation algorithms on the raw data to produce an harmonised dataset. This is the dataset that will be used for the federated analysis.

5.1 Harmonisation

Harmonisation requires the consortium agree on algorithms that, when applied to each dataset, will result in a common set of variables across all studies in the consortium. These algorithms are then coded in JavaScript on the server. Since writing the code in JavaScript is specialist knowledge, this can initially be done by the Project's harmonisation team. To do this they will need a username that has sufficient permissions to set up the algorithms without being able to see the individual level data (higher privileges can be granted by the study).

5.1.1 Set up Harmonisation User

The credentials for the Harmonisation user are added as follow:

- 1. Go to the "Administration" page, and click on "Users and Groups" section,
- 2. Click "Add User", and select "Add user with password",
- 3. Give the user the name: Harmonisation,
- 4. Choose a password,
- 5. Inform the project technical support of the password (password can be changed by the user afterwards).

5.1.2 Give Harmonisation User Permissions

The Harmonisation user must be able to see the data dictionary and summaries of the study-specific table:

- 1. Go to the project page, tables section,
- 2. Go to the study-specific table page,
- 3. On the "Permissions" tab, click "Add Permission" and select "Add user permission",
- 4. In the name field, type Harmonisation,
- 5. Leave the default permission of "View dictionary and summaries" (depending on the agreement with the study, the permission "View dictionary and values" should be chosen instead), and save.

Then the Harmonisation user should be granted the permission to create a view in this project:

- 1. Go to the project page, tables section,
- 2. On the "Permissions" tab, click "Add Permission" and select "Add user permission",
- 3. In the name field, type Harmonisation,
- 4. Leave the default permission of "Add table", and save.

The view that will be added by the Harmonisation user will transform the variables of the study-specific table into the harmonised variables (without compromising the individual level data).

5.2 Federated Analysis

Do not complete this section until it has been agreed which users will be permitted to run analyses on your data.

Once the harmonised dataset is ready, users will need to be given permission to run analyses on your data.

5.2.1 Add a Datashield User

This section only needs to be completed for new users:

- 1. Go to the "Administration" page, and click on "Users and Groups" section,
- 2. Click "Add User", and select "Add user with certificate",
- 3. Give the user the name supplied by the project technical support,
- 4. Paste the certificate for that user (supplied by the project technical support) and save.

New users will need to be given permission to connect via DataSHIELD:

- 1. Go to the "Administration" page, and click on "DataSHIELD" section,
- 2. Click "Add Permission", and select "Add user permission",
- 3. Type the name chosen above in the name box,
- 4. Leave the default selection of "Use" and save.

5.2.2 Give users permission to analyse data

Now it is necessary to set up the permissions for each user on the project:

- 1. Go to the project page, tables section,
- 2. Go the the harmonised table page,
- 3. On the "Permissions" tab, click "Add Permission" and select "Add user permission",
- 4. Enter the name of the user,

5.	Leave the default permission of "View dictionary and summaries", and save.