



PopMedNet: Introduction



Figure 1: Overview of PopMedNet™

Overview

PopMedNet[™]'s development was pioneered by the Therapeutics Research and Infectious Disease Epidemiology (TIDE) group of the Department of Population Medicine (DPM) of the Harvard Pilgrim Health Care Institute (HPHCI), an appointing department of the Harvard Medical School. PopMedNet currently supports several large DDNs, including the Sentinel System, PCORnet, and the NIH Collaboratory.

PopMedNet[™] is an open-source application used to facilitate multi-site health data networks. It uses a distributed network design that enables data partners to retain full control of their data. Investigators send questions to data partners¹ for review and response. PopMedNet eliminates the need for assembling patient records in a centralized repository, thus preserving patient privacy and confidentiality.

PopMedNet is made up of three primary components:

- **PopMedNet Query Tool:** The web-based application from which queries are distributed. It is typically used by the analysis center to create, distribute, and manage queries.
- **DataMart Client:** Is a locally installed application that acts as inbox for data partners to receive packages and transfer results to the analysis center.
- Web Service API: API used to implement all application logic that processes requests against a network. The API is also used for integrations with PMN-allied services and applications.

¹ Data partners are data owners who partners with each other in a study.



Figure 2: Illustration of PopMedNet[™] Components

The following diagram shows the basic operating model of PopMedNet in a single request/response roundtrip. However, it can also operate iteratively until some conditions are met, such as that employed by the Distributed Regression data model (below). Additionally, it can be configured to run unattended.



Figure 3: Basic Operating Model of PopMedNet™

The goal of PopMedNet is to facilitate distributed analysis of electronic health data in order to support medical product safety surveillance, disease surveillance, comparative effectiveness, quality, medical resource use, cost-effectiveness, and related studies. It does this by enabling the creation of health data networks that allows the data owners to keep and control uses of their data, while at the same time allows customized access and governance for each network.

The concerns of the network stakeholders are addressed in the design and governance models of the PopMedNet software platform.

Key Features

PopMedNet features:

- Multiple queries interactively composed and distributed in a single request to multiple data marts²(Multiple Menu Driven Queries – MMDQ).
- Query responses are asynchronously returned that is, a query does not have to be responded to immediately and not all data marts have to respond.
- Customizable workflows.
- Auditing and search capabilities.
- Flexible role-based access control system enables the enforcement of varying governance policies.
- Approval processes for submitting and responding to queries
- Easy integration with project management tools such as Jira through API interfaces
- Allows for easy tracking of metadata associated to each request



Figure 4: Diagram of PopMedNet[™] Components-Feature

² Data marts are software components representing the data owners' data sources.

Architecture

PopMedNet has two components. It has a .NET web application component (Portal) and a Windows application or web-based client component (DataMart Client). The .NET web component uses a modern service-oriented architecture (SOA) with a robust API serving a dynamic UI using the MVVM pattern. The DataMart Client (DMC), uses an adapter architecture to support different data models. A variety of adapters are available, and able to support distributed regression, file transfer, ad-hoc SQL queries, and dynamically composed menu-drive queries (MMDQ) against local data sources (supporting SQL Server, Postgres and Oracle).

PopMedNet is a .NET Framework application, utilizing <u>ASP.NET</u> MVC5 for the implementation of the website application and WinForms for the desktop application. Entity Framework 6 is used for data access, and Typescript for client-side scripting.

The DataMart Client (DMC) is a locally installed Microsoft Windows[®] application that acts as an inbox for data partners to receive query packages and transfer results to the analysis center. All file transfers (query requests and responses) between the data partners and the analysis center are achieved through secure HTTPS/SSL/TLS connections. There are no virtual machines, open ports, Virtual Private Networks, or any external access to data partner data, abating concerns about data security and unauthorized access. The system ensures only approved queries are submitted to and responses returned by participating data partners with several levels of software-enabled governance.

Portal (Web)		DataMart Client	Application	DataMart Client Server (Web)		
View		WinForm		View		
REST API		Adapters		REST API		
.NET 4.8	EF6	.NET 4.8	EF6	.NET 4.8	EF6	

Governance - Permission

Individual permissions are set on different levels within a PopMedNet instance. The permission will always apply to whatever level the permission is set at. For example, if View Request is set on a specific project, it would let that user view all requests sent in that project, but not another project. If the same permission was set on an Organization level, it would let the user view all requests sent to DataMarts that belong to that organization, regardless of which project the requests are sent in. The main levels where we set permissions in practice are:

- Site-wide: affecting everything on the PopMedNet instance
- Project: affecting everything in that project
- Project-DataMart: affecting everything for that DataMart within that project
- Project-Request Types: affecting everything for that request type within that project
- Organization: affecting everything at that organization (including DataMarts owned by that organization)

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Figure 5: Displays the Project Permissions for a Tutorial project

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	Permission						
	Permiss	sion			Inherit	Allow	Deny
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Figure 6: Displays the permissions for granting access to a specific DataMart within a Project

Other locations that may be used (this is not an exhaustive list):

- Project-Organization: affecting everything for that organization and every DataMart owned by it in that project
- Request Types: affecting that specific request type
- Registries: affecting that specific registry
- User: affecting that specific user

Home Requests * Profile Resources Reports * Network * ome / Users / TUTORIAL DATAMART ADMIN irst Name* Middle Name TUTORIAL mail Address* Phone # popmednet_support@harvardpilgrim.org rganization User Name* Operations Center * tutorial_datamart_admin Security Groups Permissions Events Notifications Authentication History	Contact Us L Active Deactiv e t# Change Passwo
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	🕂 Add Security Group

Figure 7: Displays how the collections of permissions in groups are assigned to a user

Permissions set on higher, more all-encompassing levels are inherited at lower levels. This means that if an Approve/Reject Results permission is set on a project-level, that permission is effectively inherited at all Project-DataMart and Project-Organization levels within that project. You can deny permissions at a lower level, and that will overrule the inherited permission.

How It Works

In PopMedNet, the Portal handles all the governance and acts as a hub for all queries. That ensures that the coordinating center³ can expect:

- Consistency of information across data partners
- Quality of data
- Flexibility to handle different network structures with overlapping data partners
- Ability to track and report operational activities
- Managing multiple projects

The DataMart Client (DMC) allows data partners to control access to their data before sending it to the Portal. For the data partners, it will:

- Provide protection of PHI
- Prevent loss of control over proprietary information

The researcher will have no direct access to data but is shielded from the differences among networks' data models.

³ Coordinating center runs the study and issues queries from the PopMedNet Portal.

A typical PopMedNet[™] request-response cycle is as follows:

- 1. Request: Investigators distribute data requests constructed in the point and click web interface
- 2. Review: Data Partners receive and review requests in their DataMart Client
- 3. Respond: Data partners execute the requests against their local data and upload results
- 4. Download: Investigators access results in the query tool



Figure 8: Diagram of PopMedNet[™] Request Cycle

Key Data Models Supported

Modular Program Distribution

The Modular Program Distribution request model allows you to distribute modular program packages to the network DataMarts. The Modular Program request model provides two request types: Modular Program. The request specific criteria for these request types is the same and displayed in the figure below.

If data partners upload Modular Program results containing all-run signature files, the signature file information may be automatically read by PopMedNet and displayed on the Request Details page.

	-	Please enter your FTP credentials b	elow:	
Select files	Done 🕑	Address*	Port*	
glossary terms.docx	100%	i.e. sftp.example.com	22	:
and all all a second and a second a se		Login*		
		Password*		
		Connect		

Figure 9: Illustrates how a file is attached within a Modular program request



Figure 10: Modular Program workflow utilized for FDA Request

Multiple Menu Driven Query

Menu-Driven Queries (MDQs) utilize a simple point-and-click interface to add terms to the request criteria that are joined through logical operations (and/or), associations, and then grouped according to the chosen stratification(s). A major benefit is that users do not need programming expertise to create and execute MDQs. MDQs execute against data stored within a Common Data Model and output results based on the criteria entered. Additionally, files can be distributed with a query.

MDQ further supports the ability to send multiple MDQ in a single request. This would include the ability to specify distinct criteria groups and stratifications for each MDQ within the request. Data partners can run and upload the results for all MDQs simultaneously using the DataMart Client.

When an MMDQ is received by a Data Partner, the software gathers all user submitted queries, runs them simultaneously, and results are sorted into appropriate tables based on the request criteria. When this process is complete, results may be returned to the requestor. Data partners may also configure their DMC to automatically run and upload the results of MDQs and MMDQs. This auto-run and upload feature functions by queuing the queries as received by the DMC such that the first query will run and upload results prior to moving onto the next query in the queue.

MDQ adapter uses Entity Framework for conversion into SQL for SQL Server, Oracle and Postgres.

Key features of MDQ architecture include:

- Visual query composition the MDQ architecture allows users to develop a query using a point-andclick interface using logical operations (and/or), associations (criteria group) and stratifications (group by);
- Flexibility MDQs can be executed against a variety of database types;
- Grouped querying the MDQ architecture allows creation and submission of multiple MDQs in a single request;
- Ability to define and share custom query templates;
- Sharing of query specifications, development of sharable phenotypes;
- Electronic workflow that guides users through query composition, governance, distribution, and response viewing;
- Ability to aggregate and export results to multiple file formats; and
- Use of PMN governance and access controls.



Figure 11: Menu Driven Query Workflow

Criteria Groups		+ New Group 🔰 Import Codes
Click the [+ New Group Disease terms within a AND-ed to determine th Criteria Group by check	button to add criteria groups. Criteria groups form col criteria groups are OR-ed, whereas demographic term e final cohort which will display a single or stratified pa ing "Exclude Criteria Group" box which will filter out th	horts that are determined by terms within each group. ICD9 Diagnosis and ns (Gender, Race, Age) and Visit terms are AND-ed. Multiple Criteria Groups are atient count based on the Report Selector options selected. You may negate a ne group's cohort from the final cohort.
Criteria Group:	Group 10	C Save as Template
Group Name*		
Group 1		
Add Terms	Diagnosis Code Set: ICD-10-CM Selected Codes:	• Remove
Prescribing	M05.9	
Diagnosis	 Exact Match Starts With 	æ
Procedure Codes		
Criteria		
Demographic •	Age Range	
Patient Reported	Hispanic	
Outcome	Race	
Trial 🕨	Sex	

Figure 12: Menu-Driven Query User Interface.

Q ViewSQL C	2
### Query 1: Menu-Driven Query: Primary Template ### SELECT 1 AS [C1]. [GroupBy1] [K2] AS [HSPANIC]. [GroupBy1] [K2] AS [HSPANIC]. [GroupBy1] [K3] AS [R2CE]. [GroupBy1] [K3] AS [R2CE]. [GroupBy1] [K3] AS [R2CE]. [Edent1] [SEX] AS [K2]. [Edent1] [SEX] AS [K2]. [Edent1] [RACE] AS [K3]. COUNT(1) AS [A1] FROM [dob] [DEMOGRAPHIC] AS [Edent1] WHERE (UPPER[Edent1] [SEX] IN (NF: NMT)) AND (UPPER[[Edent1] [SEX]) IS NOT NULL) AND (([Edent1], [HISPANIC] = @p_ling_0] 0 R ([[Edent1] [HISPANIC] IS NULL) AND (@p_ling_0] IS NULL) AND (([Edent1], [HISPANIC] = @p_ling_0] 0 R ([[Edent1] [HISPANIC] IS NULL) AND (@p_ling_0] IS NULL) AND (([Edent1], [HISPANIC] = @p_ling_0] 0 R ([[Edent1] [SEX], [Edent1] [HISPANIC], [Edent1] [RACE]) AS [CoupBy1] ### Query 2: Cohot 2 ### SELECT 1 AS [C1]. [GroupBy1] [AS IHISPANIC]	
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	lose

Figure 13: Structure of a Multiple Menu Driven Query (MMDQ) as seen in the DataMart Client

Distributed Regression Analysis (DRA)

Distributed Regression provides data infrastructure and methods that support robust statistical analysis for binary, survival, and continuous outcomes. It enables the ability to conduct rapid and secure distributed regression analysis in distributed data networks. DRA is mathematically equivalent to the conventional regression analysis of pooled individual-level data. It achieves the same level of statistical sophistication using only summary-level information, thereby offering better protection for individual and institutional privacy without jeopardizing the scientific rigor of the analysis.

Distributed Regression adaptor (DRA-adapter) has the following unique characteristics:

- Supports multiple data sources with unique populations, which are often needed to answer clinical questions
- Balances analytic data requirements, patient privacy and confidentiality, local governance, and proprietary considerations

It can:

- Automatically download new files (individual and zipped) to specified location when all DataMart's responded.
- Automatically launch SAS or R interpreter and run program delivered as request payload.
- Different levels of workflow automation (completely manual, semi-automated, and fully automated).

Three regression models are supported:

- 1. Linear Regression
- 2. Logistic Regression
- 3. Survival Analysis (Cox Proportional Hazard Model)



Figure 14: Iterative process to perform distributed regression analysis

A typical DRA includes 3 major steps. Step 1 involves the assembly of a harmonized individual-level analytical dataset at each data partner. In step 2, the analysis center and each data partner execute a DRA algorithm locally. Step 3 involves the iterative transfer of the DRA algorithm outputs between the data partners and the analysis center until the regression model converges or the process reaches a prespecified maximum number of iterations. PopMedNet workflow is utilized to transfer input files and computation directions interactively and automatically between data partners and the analysis center.





Executing External Programs

The DataMart Client (DMC) supports data models that interoperates with external programs. For example, DataMart Client can be customized to execute an external program like a command interpreter such as R or SAS interpreters or executable programs. Alternatively, it can be customized to deposit files that are monitored by an external program. DR utilizes the latter capability of DMC to perform its iterations automatically without human intervention.



Figure 16: DataMart Client (DMC) Model Settings

Deployment Infrastructure

The PopMedNet team recommend deploying PopMedNet is a load-balanced, clustered configuration.

PopMedNet must be installed on Windows Server running IIS and backed by SQL Server database that is not public facing.

Both the portal and the API are public facing and should require HTTPS/TLS 1.2 communication protocols.

Acknowledgements

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- FDA's Sentinel Initiative
- PCORI's National Patient-Centered Clinical Research Network (PCORnet)

In addition, Harvard Pilgrim Health Care Institute serves as the coordinating center for several other initiatives that use PMN and its associated software ecosystem including:

- Biologics and Biosimilars Collective Intelligence Consortium (BBCIC)
- Office of the Assistant Secretary for Planning and Evaluation (ASPE) & Food and Drug Administration
- Privacy-protecting distributed analysis of biomedical big data project funded by the National Institute of Biomedical Imaging and Bioengineering of the National Institutes of Health

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