

# MEASURING DATA QUALITY IN VORTALS

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**Abstract:** Nowadays, Web portals serve as an important means to access information. It is common for users to use information obtained from the web to carry out their daily tasks. These users need to ensure that this information suits their needs. PDQM (Portal Data Quality Model) is a model that assesses the quality of portal data. PDQM has been defined in such a way that every time that one wishes to evaluate a different portal context, a specific configuration of the model must be used. In an attempt to go beyond this limitation and with the idea of making PDQM a more generic model, we have adjusted it to be applied to vortals, the largest category of portals. This article describes the first phase of adapting PDQM.

## 1 INTRODUCTION

Increasingly, more companies are deciding to use web portals to sell their products or as an access point for the tools that their employees need to perform their jobs. One of the aims of many web portals is to select, organize and distribute content (information or other services and products) in order to satisfy their users/customers (Domingues et al., 2006). Therefore, it is essential that the information contained in a portal meet certain quality standards.

It is important to note that the success of a web portal depends on whether it receives access from users. Logically, if users stop using a portal, it will disappear. Therefore, one of the main features to evaluate with web portals is the quality of the data that they provide.

In recent years, the research community has started to look into the area of data quality (DQ) on the web (Gertz et al., 2004). However, although some studies suggest that DQ is one of the relevant factors when measuring the quality of a web portal (Moraga et al., 2006), few have addressed DQ in these portals.

The quality of data can be approached from different perspectives: the data consumer (the user), the data producer (who produces it) and the administrator (responsible for maintaining the data). In (Caro et al., 2008) the quality of data from the

consumer's perspective has been studied. In their model, they have identified four significant features of data quality: intrinsic DQ, operational DQ, contextual DQ and representational DQ. Of these four features, the one that has been analysed in the greatest detail is representational DQ, for which measures and a Bayesian network, that processes it, have been defined.

Moreover, a tool called PoDQA that can automate calculations, has been built (<http://podqa.webportalquality.com/>). The tool begins with the web portal address and automatically calculates the indicators using the Bayesian network to determine the portal's representational DQ level. However, despite the novelty and usefulness of the proposal, it has one limitation: the model and the Bayesian network must be configured depending on the domain of web portal to evaluate. That is, using this proposal, it is necessary to adapt the probability tables that the Bayesian network uses to estimate the representational DQ level according to the type of web portal (university, bank, government, etc.) At this moment, the model and the tool have been validated for university web portals.

In this study, we intend to adapt this proposal to include a larger number of portals. Specifically, we focus on vortals, which are portals designed to meet the needs of a specific community, for example, bank portals, whose objective is to meet the needs of their clients and employees. In order to carry out this

adaptation, the original model was studied and modified in an attempt to change its probability tables to make them more generic, eliminating the restrictions (or values) that are specific to university web portals. Finally, to check the usefulness of our proposal, it was validated using a survey.

This study is structured as follows. Section 2 presents a brief discussion about vortals. Section 3 presents the data quality model for web portals and section 4 presents the experiment whose objective was to validate the proposal. Finally, some conclusions and future works are presented.

## 2 VORTALS

A web portal is a site that aggregates information from multiple sources on the World Wide Web and organizes this material in an easy, user-friendly manner (Xiao, Dasgupta, 2005). Web portals help users to locate information on the Internet. Therefore, portals integrate an increasing amount of information and functionality (Zirpins et al., 2001). Portals have several classifications, one of which divides portals as follows:

- Horizontal Portal, or hortal: provides consumers with access to a number of different sites in terms of content and functionality (Xiao, Dasgupta, 2005). They usually offer a broad array of resources and services in an effort to convince users to make the site their home page and let them use it as long and often as they wish (Zirpins et al., 2001). An example of horizontal portals is Yahoo (<http://es.yahoo.com>).
- Vertical Portal, or vortal: portals that specifically target a particular audience and contain a great amount of information and content within a specific category (Clarke, Flaherty, 2003). They offer content and services aimed at a specific domain or community (Zirpins et al., 2001). One kind of vortals is the ‘Enterprise Information Portal’, also called ‘Corporate Portals’. These are web applications that integrate all types of data and services related to a specific company and offer support information, detailed product catalogues and the functionality of an online shop (Zirpins et al., 2001). Corporate portals ensure that any interested members of a corporation always have immediate and ready access to all necessary information and services (Guruge, 2003). A museum web portal is a good example of a vertical portal. University or bank web portals are other examples.

## 3 PDQM: A DATA QUALITY MODEL FOR WEB PORTALS

PDQM is a data quality model for web portals that focuses on the perspective of the data consumer. This essentially means two things. First, the model only evaluates the portal data accessible to the data consumer. Second, the model evaluates data in much the same way as a data consumer.

The development of PDQM was divided into two stages: the theoretical definition and the operational definition of the model. The goal of the theoretical definition was to determine a set of DQ attributes that are relevant to data consumers when it comes to evaluating the DQ of any web portal. For this, a set of DQ attributes proposed in the literature was selected to evaluate DQ in a web context and then a selection of the most relevant attributes for a web portal was made (based on the functionality of a web portal (Collins, 2001) and the Internet users’ DQ expectations (Redman, 2000)). This set was empirically validated, producing the result of the final set of DQ attributes for the model, as shown in Table 1. More details on the development of the theoretical version of PDQM can be found in (Caro et al., 2008).

Once the theoretical version of PDQM was defined, the second stage consisted of converting it into an operational model, i.e., a model that could be used to evaluate DQ. This conversion basically entailed defining a structure in which the attributes and their relationships could be organized and defining measurements, as well as the setting in which it was going to be applied (in the case of (Caro et al., 2008), for university portals).

Table 1: DQ Attributes of PDQM.

Attractiveness	Consistent Representation	Interpretability	Response Time
Accessibility	Currency	Novelty	Security
Accuracy	Documentation	Objectivity	Specialization
Amount of Data	Duplicates	Organization	Timeliness
Applicability	Ease of Operation	Relevancy	Traceability
Availability	Expiration	Customer Support	Understandability
Believability	Flexibility	Reliability	Validity
Completeness	Interactivity	Reputation	Value added
Concise Representation			

Bearing in mind the subjectivity implicit in the perspective of data consumers and the uncertainty inherent in the perception of quality (Eppler, 2003), in order to create an operational definition of PDQM, a probabilistic focus was used that relied on Bayesian networks and diffuse logic (Malak et al., 2006). Bayesian networks (BN) are used to structure, refine and represent PDQM for DQ

evaluation in web portals while diffuse logic is used to transform the results of the measurements applied to a portal in valid entries for the Bayesian network. This will be summarized below, but a more detailed description can be found in (Caro et al., 2008).

To obtain the operational version of PDQM, the attributes were first organized into four DQ categories: intrinsic, operational, contextual and representational. Then, within each category, influential relationships were established between the attributes to determine which attributes were dependent on other attributes. For example in the category of representational DQ, it was determined that data organisation influences understandability. As a result of this, a BN was obtained (see Figure ) which organizes the 33 DQ attributes into four network fragments (one for each DQ category).

Once the Bayesian network was defined, it was necessary to make the model function in a specific context, for which a probability table was defined for each node in the fragment (Figure shows the probability table for the Consistent Representation, Volume of Data and Attractiveness nodes). Since these tables had to be specific for the context of university portals, their values were defined by experts in university web portals (the experts were a group of DQ researchers and university web portal users). Furthermore, the attributes particular to the domain, i.e., university portals, were reflected in the interrelationships.

Then, one indicator, or quantifiable variable, was defined for each entry node in the fragment (the indicators were: Level of Consistent Representation (LCsR), Level of Concise Representation (LCcR), Level of Documentation (LD), Level of Amount of Data (LAD), Level of Organization (LO) and Level of Interpretation (LI), in Figure ). The value of each indicator was calculated based on a set of measures applied to a university portal.

Since each indicator takes a numerical value between 0 and 1, fuzzy logic was used to transform this value into discrete variables. The idea here is that the different values that an indicator may take are replaced by a set of probabilities which represent the degree of membership of each value in various fuzzy labels/classes (for example, ‘High’, ‘Medium’, ‘Low’). Hence, for each indicator, a membership function was defined that transforms the value of that indicator into a set of probabilities, each of which corresponds to a label/class (Malak et al., 2006). A trapezoidal membership function was used for this transformation.

Thus, in order to obtain the score for the representational DQ of a given web portal, PDQM follows certain steps. First, it calculates the measures associated with the indicators (the objective

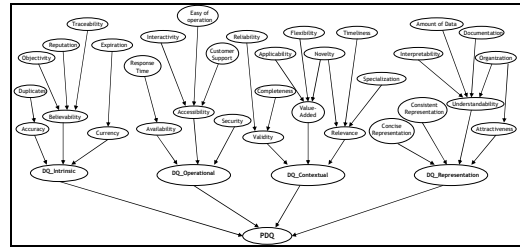


Figure 1: BN graph to represent PDQM.

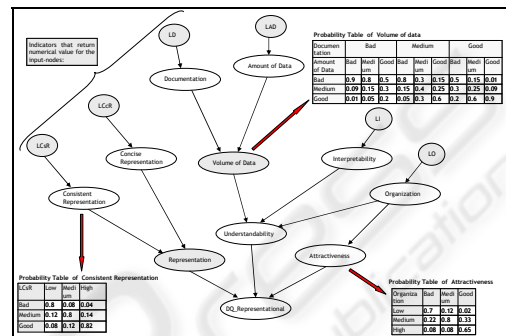


Figure 2: The network fragment of representational DQ.

measures are calculated automatically and the user’s evaluations are requested). From these measures, the indicators are calculated and transformed into a set of probabilities for each entry node. These probabilities are entered into the BN. From each piece of evidence, and using the corresponding probability table, each node generates a result that is propagated, via a causal link, to the child nodes for the whole network to the level of the representational DQ. This process is applicable to the whole PDQM model, although only the representational DQ quantifying model was developed in (Clarke, Flaherty, 2003).

Finally, in order to make the PDQM accessible to web portal users, a tool was developed. The tool is called PoDQA (Portal Data Quality Evaluation) and, at this time, only implements the representational DQ fragment.

#### 4 ADAPTING PDQM TO VORTALS

As noted above, PDQM was only – and partially – made operational for university web portals. However, since it was largely defined without considering the application domain, we believe that it can be more generically applicable. For this reason, we decided to make the model operational for more generic portals (vortals). To begin, this was consistent with our focus on the development of the

PDQM model in the sense that it contemplates its adaptation to different web portal contexts or, in terms of the definition of vortals, to particular audiences. However, from a practical point of view, having as many model configurations as there are portal contexts to be evaluated is complicated. In order to adapt the model to vortals, we decided to reconfigure the probability tables for the corresponding network fragment to the representational DQ and check this with different vortals to evaluate whether it is possible to obtain a generic definition of the model.

Our working hypothesis was that if we achieved a generic configuration of the probability tables for this fragment, it would also be possible to do so for the rest of the PDQM fragments.

The following subsection presents the first experiment designed to determine the adaptability of PDQM to vortals.

#### 4.1 The First Experiment to Check the Proposal

Before developing the experiment, representational DQ fragment probability tables were adjusted. To do this, we worked with a group of web portal experts who redefined the probability tables.

Next, we began to define the experiment to see whether PDQM could be adapted to evaluate vortals using a generic configuration. The experiment had to allow a comparison of the evaluations of a group of users with respect to a group of vortals with the evaluation produced by PoDQA. To do this, the PoDQA tool had to be adapted as well.

The hypothesis was that if the users' evaluation and that of the PoDQA agreed, then it would be possible to adapt PDQM to vortals. If there was no agreement, then it would not be possible to consider a generic configuration to evaluate any type of vortal. Consequently, the experiment was based on the development of a survey to obtain user evaluations. Each activity that was designed to define and carry out the survey is described below.

**Activity 1: Defining the Survey Objective.** The goal of the survey was defined as follows: 'To obtain the opinion of a group of vortal users with respect to the representational DQ of a group of vortals'.

**Activity 2: Planning and Designing the Survey.** Considering the objective as defined, the survey was geared towards vortal users (data consumers) and considered three types of vortals: university, museum and city councils. So that the users could evaluate the representational DQ of the vortals, three

activities were defined for each of them and then, on the basis of that experiment, the users were asked to evaluate the representational DQ (for this, they had to answer a total of five questions per vortal being evaluated).

**Activity 3: Verifying the Availability of the Resources to Carry out the Survey.** The resources needed to create the survey as well as distribute it to the subjects were available. Specifically, once the instrument was created, it was distributed to subjects in two ways: direct delivery in printed form or e-mail delivery.

**Activity 4: Designing the Study.** Taking the objective of the survey into consideration, the survey was created using a descriptive design. In our case, we wanted vortal users to describe their opinions regarding the representational DQ.

**Activity 5: Preparing the Study Instrument.** A group of questions was selected in accordance with the goal of the experiment, i.e., questions relating to a vortal's representational DQ. The instrument contained a first part which explained the survey's objective to the subjects and gave them a definition of the representational DQ of a portal. The second part gave the subjects the URL of a university vortal and the description of three activities that they had to perform within it. Each activity consisted of searching for information within the portal and answering a question relating to that activity. This ensured that the subjects actually used the portal and consequently were capable of determining its representational DQ. Following this, they were given five questions which asked them to evaluate some specific aspects of the representational DQ and assess the overall representational DQ. All of these questions were closed. When assessing the overall representational DQ, the subjects were asked to select one of the following categories: Low, Medium-Low, Medium, Medium-High and High. The third and fourth parts were the same as the first two, but gave the subjects the URL of a museum and a city council vortal respectively. Here as well, the subjects were given three activities for each site and then five closed questions about the representational DQ. Therefore, each user had to give his/her opinion about three different vortals (university, museum and city council). Each of the activities included in the instrument was verified in such a way that there was none that could not be done by the subjects. The questions were created using conventional language and expressing simple ideas. Furthermore, to avoid confusion, no negative questions were included.

**Activity 6: Validating the Survey Instrument.** Once the survey was designed, it was given to a small number of colleagues to evaluate (i.e., to point out any questions that had not been clearly formulated or were not easy to understand). As a result of the evaluation, we learned that no questions needed to be modified.

**Activity 7: Selecting the Sample.** In order to select the sample, the condition was that the subjects had to be regular vortal users. Following this, and using the convenience sample strategy, a sample of 95 subjects was selected, made up of 54 Spanish subjects and 41 Latin American subjects.

**Activity 8: Applying the Survey.** The survey was sent by e-mail to one part of the chosen subjects and in printed form to the others. Subjects were given three weeks to complete the survey. After this time, we received a total of 64 answers, giving us a response rate of 67%.

**Activity 9: Analyzing the Data.** Once we received all of the surveys, we verified that they were all complete and contained valid answers. This check revealed that all of the subjects had answered all of the questions relating to DQ, but that one of the proposed activities had not always been completed correctly. After analyzing these surveys to determine if they had to be eliminated. However, we decided to include them since it was clear that although the subjects had not completed the activity and answered the associated question, they had had a sufficient interaction with the vortal to be able to give an opinion about its representational DQ. It is important to bear in mind that the objective of the activities was to be sure that the subjects used the vortal before giving their opinion of the representational DQ.

Once the answers were analyzed, the level of the representational DQ of each vortals was determined in accordance with the criteria of the subjects surveyed. To obtain this value, the average of all of the evaluations obtained for each of the vortals was calculated. (second column) shows the results for each vortal evaluated and represents the evaluation of the majority of the subjects.

Once these survey data were obtained, the next step was to evaluate the same group of vortals using PoDQA. (third column) shows the results of this evaluation.

When a comparison is made of the data obtained

Table 2: Representational DQ level found in the survey and with the PoDQA tool.

Portal	Representational DQ level	
	Survey	PoDQA
University of Sevilla	Medium	Medium-High
University of Castilla-La Mancha	Medium	Medium
University of Huelva	Medium-High	Medium-Low
Prado Museum	Medium-High	Medium-High
Thyssen-Bornemisza Museum	Medium	Medium
Picasso Museum	Medium	Medium-Low
Ciudad Real city council	Medium-High	Medium-High
Coruña city council	Medium	Medium
Salamanca city council	Medium	Medium-Low

from the survey and the data obtained from the tool, the following observations are possible:

- Of the nine portals evaluated, for five of them, the evaluations made by the users and the PoDQA evaluations match completely (see Figure 3).
- This means that 56% of the PoDQA evaluations and the surveys matched. Although this is not a very high percentage, it is possible to say that the matches are distributed between the different types of vortals and that this can serve as a preliminary method to obtain a generic configuration of the model.
- With respect to the four portals where there is no match, it must be noted that for three of them, PoDQA was more demanding in its evaluation than the subjects and therefore found a lower level of DQ in the portals. This, again, could be a sign that it is possible to adjust the measurement to create a generic configuration.

Finally, there is only one case in which the opinion of the users and the evaluation obtained from the PoDQA tool differ completely.

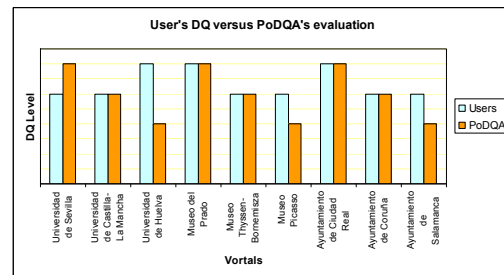


Figure 3: Comparison of PoDQA and subject evaluations.

Therefore, regarding our initial objective, it is possible to affirm that PDQM can be used to evaluate vortals with the modifications that have been made. It has been confirmed that the PoDQA tool, which implements PDQM, provides a similar

number of matches between its evaluations and the evaluations provided by the users regardless of the web portal type. This means that it is not limited to evaluating only university portals, but is also valid for other portals like those of museums and city councils.

## 5 CONCLUSIONS AND FUTURE WORKS

PDQM is a data quality model for web portals that focuses on the perspective of the data consumer. Consequently, PDQM evaluates only those portal data that are available to the user and evaluates the data quality taking into consideration the subjectivity of the users.

Earlier studies, which have defined the theoretical version of the model (which provides the set of attributes needed to evaluate the DQ of a portal) and the operational version (the definition that makes it possible to use it in evaluating DQ), have been partially completed. Specifically, the operational version of the model has been divided into 4 subsystems (intrinsic DQ, operational DQ, contextual DQ and representational DQ) but only one of them has been completely defined and even implemented in a tool.

In the first operational version of PDQM, the definition of a specific configuration for each web portal context to be evaluated was considered as an evaluation strategy. However, from a practical point of view, having as many model configurations as there are portal contexts to be evaluated is complicated. Due to this, and before making the rest of the model operational, we wanted to try to obtain a generic version of the configuration of the model that could be applied to any vortal.

This article has presented a first experiment geared at obtaining a generic configuration of PDQM and PoDQA. To do this, the earlier configuration of the model (defined for university portals) was adjusted and adapted considering vortals, web portals oriented towards a particular audience. As a result, we obtained a preliminary approach that seems encouraging and has given us cause to continue searching for a generic configuration.

In future studies, we wish to continue adapting probability tables to achieve a higher degree of matches between the opinion of the vortal users and the PoDQA tool. Furthermore, it will be necessary to create new surveys that can be used for two purposes. First, the survey results will make it possible to determine the evolution of the model, verifying whether it can be used for any vortal.

Second, and due to the fact that the new survey will ask questions about all of the nodes that form the Bayesian network, the results obtained from the survey will be used to help the network learn. This will exploit one of the great advantages in Bayesian networks: their capacity to learn from a specific set of data.

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