Quality of Routine Health Information System Data and Associated Factors Among Departments in Public Health Facilities of Harari Region, Ethiopia

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Abstract

**Background:** Despite the improvements in the knowledge and understanding of the role of health information in the global health system, the quality of data generated by a routine health information system is still very poor in low and middle-income countries. There is a paucity of studies as to what determines data quality in health facilities in the study area. Therefore, this study was aimed to assess the quality of routine health information system data and associated factors in public health facilities of Harari region, Ethiopia.

**Methods:** A cross-sectional study was conducted in all public health facilities in Harari region of Ethiopia. The department-level data were collected from respective department heads through document reviews, interviews, and observation check-lists. Descriptive statistics were used to data quality and multivariate logistic regression was run to identify factors influencing data quality. The level of significance was declared at P-value <0.05.

**Result:** The study found a good quality data in 51.35% (95% CI, 44.6-58.1) of the departments in public health facilities in Harari Region. Departments found in the health centers were 2.5 times more likely to have good quality data as compared to departments found in the health posts. The presence of trained staffs able to fill reporting formats (AOR=2.474; 95%CI: 1.124-5.445) and provision of feedback (AOR=3.083; 95%CI: 1.549-6.135) were also significantly associated with data quality.

**Conclusion:** The level of good data quality in the public health facilities was less than the expected national level. Training should be provided to increase the knowledge and skills of the health workers.

Background

The health information system (HIS) is one of the six building blocks of a health system designed for the generation and use of information for other functions of the health system (1). The purpose of a health information system is to routinely generate quality health data that provides specific evidence support to make decisions on health issues (2). In the "One plan, one budget, and one report" policy of Ethiopia, HIS is the core information system (3). The information revolution is one of the four big agendas of Ethiopia's Health sector transformation plan II (HSTP-II) and it is the phenomenal advancement in the methods and practice of collecting, analyzing, presenting, and disseminating information. Data quality, defined as data’s fitness to serve its purpose in a given context in terms of accuracy, completeness, and timeliness (4), is an essential element of this information revolution agenda (5).

Routine health care data have no importance unless it is accurate, processed, and used to inform decisions hence responsive to the local situations (6). Improved health system performance is directly linked with the quality and use of routine data in a country’s HIS (5, 7).

Despite the improvements in the knowledge and understanding of the role of health information in the global health system, the quality of data generated by routine HIS is still very poor in low and middle-income countries (8). The quality of data was found to be between 34–72% in many African countries (9). The large volume and variety of data generated in public health facilities are overlooked due to their limited qualities (10–13). In Ethiopia, data quality is below the 80% national expectation (14) and data completeness, accuracy, and timeliness were found to be between 33%-78% in different areas (4, 5, 14–18).

All functions of the health system and public health policy are seriously reliant on the presence and use of quality HIS data (3, 19). However, lack of quality data and poor usage are affecting the health system's performance and the health of the society. This is evident by frequent over and under stocks of supplies, poor detection and management of outbreaks, and scarcity of human resources at different times (20).

Studies identified that data quality is associated with various technical, behavioral, and organizational determinants such as personal knowledge (21), negligence and data manipulation for competition sake (22), motivation (23), user-friendliness of reporting format, standardized indicators (24), training (25, 26), feedback (14), supervision (27), sense of responsibility (28), and data use (29, 30). Although the studies conducted on the data quality, no study has been conducted at the department level in this study area to explore the factors affecting data quality. Moreover, the few studies conducted did not quantify the magnitude of the associations. Therefore, this study was aimed to assess the magnitude of the quality of routine health information system data and its determinants among public health facilities.

**Methods**

**Study area and study period**

The study was conducted in public health facilities of Harari regional State of Ethiopia from July 1 to 15, 2020. Located 518 km to the East Addis Ababa, Harari Region is one of the ten regional States in Ethiopia with an estimated area of 311.25 km². Based on the 2007 national census conducted by the Central Statistical Agency of Ethiopia (CSA), Harari Region has a total population of 183,415, and has 9 Districts (6 urban and 3 rural) and 36 kebeles (the smallest administrative units in Ethiopia) (31). There were seven hospitals in the Harari Region of which one was owned by the Harari Regional Health Bureau while the rest was owned by other governmental and private organizations. Among these, the 2 hospitals were governmental public health facilities. There were also 8 public health centers, 32 health posts, 10 not-for-profit private clinics, and 15 private clinics for profit in the Harari Region.

**Study Design**

A facility-based cross-sectional study design was employed.
Study population

The study populations for this study were all departments that were implementing routine health management information systems (HMIS) in all public health facilities of Harari Regional State.

Sample size determination and sampling procedure

The sample size of the study was determined by using a single population proportion formula

\[ n = \frac{Z_{\alpha/2}^2 \hat{p}(1 - \hat{p})}{d^2} \]

Where; \( n \) = Sample size, \( Z_{\alpha/2} \) = Standard normal distribution corresponding to a significance level of alpha (\( \alpha \)) of 0.05 = 1.96, \( \hat{p} \) = magnitude of the data quality of routine health information system among departments in public health facilities of Dire Dawa (75.3%) (14) and \( d \) = degree of precision = 0.05.

Accordingly

\[ n = \frac{(1.96)^2 \times (0.753)(0.247) \times 10\% + \text{non-response rate}}{(0.05)^2} \]

Since the 245 total number of departments was less than 10,000, the correction formula was used and gave \( n = 314/1 + (314/245) = 138 \). However, since the existing departments implementing health information systems were found to be manageable, a census of all (245) departments found in all 42 public health facilities (8 health centers, 32 health posts, and 2 hospitals) was considered.

Data collection instrument

The questionnaire was adapted from the Performance of Routine Information System Management (PRISM) assessment tool version 3.1. (32), and used with little modifications to collect quantitative data. It comprised four sections: The first section was composed of questions related to socio-demographic characteristics of the department heads such as age, educational status, working experiences, professional category, salary, residence, and others. The second and third sections of the questionnaire included items assessing the technical, organizational, and behavioral factors associated with the quality of routine health information system data respectively. Observations, interviews, and document reviews guided by an observation checklist (fourth section of the questionnaire) were used to collect data on the departments’ data quality from all the departments through their respective department heads/representative of each department.

Data collection procedures

Twelve health professionals who had basic data management training and prior experience of data collection and four health professionals who were members of the HIS monitoring team were assigned for the data collection and supervision respectively. Before the data collection, two days training was provided on the purpose, how to collect data, and on ethical issues emphasizing the importance of the safety of the participants, and data quality.

The data were collected by going to all the health facilities, explaining the aim of the study, ensuring the confidentiality of the data, obtaining the written consent from each facility head and participants, observing and interviewing to fill the checklist, and distributing the questionnaire to the department heads to read and fill the rest.

Study variables

Dependent variable

Data quality was the dependent variable of the study.

Independent variables

The independent variables include:

Organizational variables: training, feedback, supervision, computer, internet, reward, engagement in HIS activities, performance review meeting, and data use,

Technical variables: presence of standard indicators, report formats, and trained person able to fill format, and

Behavioral variables: motivation, attitude, data manipulation for competition, negligence, sense of responsibility, knowledge, and data quality checking skills.

Operational definitions
**Good quality data:** The data that fits the criteria for the three quality dimensions - accuracy >=80%, completeness >=85%, and timeliness >=85% (27, 33).

**Poor quality data:** The data that does not fit the three criteria (accuracy <80%, or completeness <85%, or timeliness <85%).

**Completeness:** refers to when the expected data elements are filled in the report format and on the source documents. The data completeness is the average of the source document or registration content completeness and reports content completeness. The data is complete if the average is >=85% (33).

**Register content completeness:** was checked by taking the last 15 cases from the registration of the department for the selected month/quarter and measured by dividing the number of completely recorded cases by the total cases checked. If the total cases/entries registered in the register are less than 15, the available cases are considered.

**Report content completeness:** at the department level, report content completeness was measured by dividing the number of data elements reported in the report format by the total number of expected data elements to be reported by the department (32). For departments that do not keep the report copy with themselves, it was taken from the HMIS unit.

**Data Accuracy:** was measured by recounting already reported data elements/indicators from the source document/register and compared with the one reported in the report format. The data elements/indicators for which the verification factor (recounted value from the source document divided by the value reported in the HMIS report) fell between 0.9-1.1 were regarded as accurate (have normal verification factor). The department's data accuracy was determined as the sum of accurate data elements/indicators divided by the total number of data elements checked. The department data is accurate if the average is >=80% (27).

**Timeliness:** was assessed as a report submission within the accepted time period through observing the reporting date on the reporting form of two randomly selected monthly reports. Departments at the health posts were expected to report from 20-22nd, departments at the health centers and hospitals report to the next level from 20-24th. The data of the department is timely if the average is >=85% (33).

**Knowledge on HIS:** It was the knowledge of rationale of routine HIS data that was measured by using the three knowledge-related open-ended questions which have a total raw score of 7 and for which the answers were coded according to the themes on the PRISM assessment user guide (32). The 50% mean score was used to classify the knowledge as good or poor.

**Data quality control**

The pre-test of the questionnaire was done on 12 departments which are found in health facilities outside of the Harari Region to identify any ambiguity, consistency, and acceptability of the questionnaire as well as the time needed to fill the questionnaires. The necessary modifications were made before the actual data collection.

The quality of data was monitored frequently both in the field and during data entry. This was done in the field through close supervision of the data collectors. All completed questionnaires were examined for completeness and consistency during data collection. An incomplete and unclear filled questionnaire was given back to the study participants immediately.

**Data processing and analysis**

Data were entered using Epi Data and exported to SPSS software version 25 for data recording, cleaning, and statistical analysis. Descriptive statistics using frequencies, percentages, tables, and figures were used to describe the departments in the public health facilities, and the overall data quality was categorized as poor and good data quality. Bivariate logistic regression analysis was done to identify variables that were candidates for multivariate analysis. All variables that have an association on bivariate analysis at a liberal P-value of < 0.25 were considered for inclusion in the multivariate analysis. Afterwards, multivariate analysis was done to control the confounding effect of other variables and to identify independent predictors of routine health data quality in the health facilities. The magnitude and direction of the relationship between the variables were expressed as odds ratios (OR) with 95%CI and P-value < 0.05 was used to declare the statistical significance. Model fitness was checked by using Hosmer-Lemeshow's test at P-value of >0.05 and a multicollinearity check was also carried out.

**Result**

**Description of the departments**

From the total of 245 departments found in the 42 public health facilities of Harari Regional state, 222 departments participated in the study with a 91% response rate. Among the 222 departments, 103 (46.39%), 82 (36.94%), and 37 (16.67%) were from the health posts, health centers, and hospitals respectively. Forty two (18.9%) maternal and child health, 40 (18%) under five out-patient, 25 (11.3%) environmental and in-patient each, 20 (9%) adult out-patient, 17 (7.7%) Tuberculosis, 11 (5%) emergency, 10 (4.5%) pharmacy, 9 (4.1%) laboratory, 7 (3.2%) voluntary counseling and testing, 6 (2.7%) Anti-retroviral therapy, 2 (0.9%) follow-up and psychiatry each, 1 (0.45%) critical intensive care unit, dental, eye clinic, neonatal care, nutrition and pathology departments each participated in the study (Table 1).
Table 1
Description of the departments participated in the study of quality of routine health information system data among departments in public health facilities of Harari Region, Ethiopia, 2020 (N = 222).

| Departments                          | Frequency | Percent |
|--------------------------------------|-----------|---------|
| Maternal and child health/MCH        | 42        | 18.9    |
| < 5 out-patient department           | 40        | 18      |
| Environmental                        | 25        | 11.3    |
| Tuberculosis                         | 17        | 7.7     |
| Adult out-patient department         | 20        | 9       |
| Pharmacy                             | 10        | 4.5     |
| Emergency                            | 11        | 5       |
| Laboratory                           | 9         | 4.1     |
| In-patient/wards                     | 25        | 11.3    |
| Voluntary counseling and testing (VCT)| 7         | 3.2     |
| Anti-retro viral therapy (ART)       | 6         | 2.7     |
| Follow-up                            | 2         | 0.9     |
| Psychiatry                           | 2         | 0.9     |
| Critical intensive care unit (CICU)  | 1         | 0.45    |
| Dental                               | 1         | 0.45    |
| Eye clinic                           | 1         | 0.45    |
| Neonate                              | 1         | 0.45    |
| Nutrition                            | 1         | 0.45    |
| Pathology                            | 1         | 0.45    |
| **Total**                            | **222**   | **100** |

**Socio-demographic characteristics of the department heads**

The mean age of the respondents was 31.32 (± 6.226 SD) years with the average working experience of 8.65 (± 5.517 SD) years. About three quarters (74.3%) were females, more than half (51.8%) reside in urban areas, 64.4% were diploma holders, and 40.1% of the department heads were health extension workers (Table 2).
Table 2
Socio-demographic characteristics of the department heads participated in the study of quality of routine health information system data in public health facilities of Harari Region, Ethiopia, 2020 (N = 222).

| Variables              | Category          | Frequency | Percent |
|------------------------|-------------------|-----------|---------|
| Age category           | < 31              | 176       | 79.28   |
|                        | >=31              | 46        | 20.72   |
| Employment years category | < 5               | 60        | 27      |
|                        | 5–9               | 81        | 36.5    |
|                        | 10–14             | 66        | 29.7    |
|                        | >=15              | 15        | 6.8     |
| Sex                    | Male              | 57        | 25.7    |
|                        | Female            | 165       | 74.3    |
| Residence              | Rural             | 107       | 48.2    |
|                        | Urban             | 115       | 51.8    |
| Educational category   | Diploma           | 143       | 64.4    |
|                        | Bachelor Degree   | 73        | 32.9    |
|                        | Master Degree     | 6         | 2.7     |
| Professional category  | Health Extension Worker | 89   | 40.1    |
|                        | Midwifery Nurse   | 21        | 9.5     |
|                        | Clinical Nurse    | 74        | 33.3    |
|                        | Others²           | 38        | 17.1    |

Others² = Health officers, druggist, laboratory professionals, and Medical doctors

**Technical factors**

Out of the 222 departments, 183 (82.4%), 178 (80.2%), and 174 (78.4%) of the departments have the standardized indicators, user-friendly reporting formats, and trained personnel able to fill the reporting formats while 39 (17.6%), 44 (19.8%) and 48 (21.6%) have no standardized indicators, user-friendly reporting formats, and trained personnel able to fill the reporting formats respectively.

**Organizational and behavioral factors**

Of the 222 departments, 33 (14.9%), 137 (61.7%), 172 (77.5%), 68 (30.6%), 69 (31%), 59 (26.6%), 177 (79.7%), 48 (21.6%) and 87 (39.2%) reported the presence of refreshment training in the last six months, feedback, supervision, computer, internet, reward, data use, good knowledge and data manipulation respectively (Table 3).
Table 3
Organizational and behavioral factors of quality of routine health information system data among departments in public health facilities of Harari Region, Ethiopia, 2020 (N = 222)

| Variables                      | Categories     | Frequency | Percent |
|--------------------------------|----------------|-----------|---------|
| Refreshment Training in the last six months | Yes            | 33        | 14.9    |
|                                | No             | 189       | 85.1    |
| Feedback                       | Received       | 137       | 61.7    |
|                                | Not received   | 85        | 38.3    |
| Supervision                    | Supervised     | 172       | 77.5    |
|                                | Not supervised | 50        | 22.5    |
| Computer                       | Yes            | 68        | 30.6    |
|                                | No             | 154       | 69.4    |
| Internet                       | Yes            | 69        | 31      |
|                                | No             | 153       | 69      |
| Reward                         | Present        | 59        | 26.6    |
|                                | Absent         | 163       | 73.4    |
| Engagement                     | Engaged        | 179       | 80.6    |
|                                | Not engaged    | 43        | 19.4    |
| Performance review meeting     | Yes            | 183       | 82.4    |
|                                | No             | 39        | 17.6    |
| data use                       | Used           | 177       | 79.7    |
|                                | Not used       | 45        | 20.3    |
| Attitude                       | Positive       | 154       | 69.4    |
|                                | Negative       | 68        | 30.6    |
| Motivation                     | Motivated      | 216       | 97.3    |
|                                | Not motivated  | 6         | 2.7     |
| Data manipulated               | Yes            | 87        | 39.2    |
|                                | No             | 135       | 60.8    |
| Negligence                     | Present        | 70        | 31.5    |
|                                | Absent         | 152       | 68.5    |
| Sense of responsibility        | Present        | 202       | 91      |
|                                | Absent         | 20        | 9       |
| Knowledge                      | Good           | 48        | 21.6    |
|                                | Poor           | 174       | 78.4    |
| Skill                          | Good           | 41        | 18.5    |
|                                | Poor           | 181       | 81.5    |

Level of the data quality

Data quality in-terms of accuracy

Among the 222 departments for which data accuracy was checked, 129 (58.1%) of departments had accurate data while 93 (41.9%) had inaccurate data (Fig. 1).

Data quality in-terms of completeness

Of the 17589 data elements checked for report content completeness for the departments, 16415 (93%) of the data elements were completely filled in the report format. Among the 5230 cases checked for registration content completeness with the relevant information, more than two third (69.6%) of the cases
were completely registered on the registration while 1589 (30.4%) were incompletely registered. From 222 departments, 89 (40%) of the departments have incomplete data whereas 133 (60%) have complete data (Fig. 2).

**Data quality in-terms of timeliness**

The departments found in the health posts were expected to submit their report from 20-22th for each month while the departments at the health centers and hospitals were expected to report from 20-24th. Of the total 222 departments whose data was checked for timeliness, majority (93.7%) submitted their report on time while 14 (6.3%) did not. Ninety four (91.26%), eighty two (100%), thirty two (86.48%) of the departments that were found in the health posts, health centers and hospitals respectively submitted their report according to their respective schedule (Fig. 3).

**Overall data quality**

From the total 222 departments, 114 (51.35%; 95% CI: 44.6%-58.1%) departments have good quality data. Forty (38.83%), fifty four (65.85%) and twenty (54.05%) of the departments at the health posts, health centers and hospitals respectively have good quality data (Fig. 4).

**Factors associated with quality of routine health information system data**

In bivariate logistic regression, the level of education, residence, type of facility, standardized indicators, user-friendliness of reporting format, presence of trained person able to fill reporting formats, internet access, refreshment training, supervision and feedback were associated to the data quality. However, the type of facility, presence of trained person able to fill reporting formats and feedback were significantly associated to the data quality in both bivariate and multivariate analysis. The departments that were found in the health centers were 2.5 times more likely to have good quality data than the departments found in the health posts (AOR = 2.499; 95%CI: 1.059–5.897). The departments that have trained personnel able to fill the formats were 2.5 times more likely to have good quality data as compared to the departments that do not have the trained person (AOR = 2.474; 95%CI: 1.124–5.445). The departments that received feedback were 3 times more likely to have good quality data as compared to the departments that do not (AOR = 3.083; 95%CI: 1.549–6.135 ) (Table 4).
Table 4
Factors associated to the quality of routine health information system data on logistic regression in public health facilities of Harari Region, Ethiopia, 2020 (N = 222).

| Variables                      | Categories          | Data quality | COR(95% CI) | AOR(95% CI) | P-value |
|-------------------------------|---------------------|--------------|-------------|-------------|---------|
|                               | Good(Number)        | Poor(Number) |             |             |         |
| Educational level             | degree & above      | 52           | 27          | 2.516 (1.422–4.452) | 1.876 (0.755–4.661) | 0.176    |
|                               | Diploma             | 62           | 81          | 1^R         | 1^R     |
| Residence                     | Urban               | 69           | 43          | 2.318 (1.353–3.970) | 1.547 (0.772–3.103) | 0.219    |
|                               | Rural               | 45           | 65          | 1^R         | 1^R     |
| Refreshment training          | Yes                 | 26           | 7           | 4.263 (1.764–10.30) | 2.269(0.825–6.237) | 0.112    |
|                               | No                  | 88           | 101         | 1^R         | 1^R     |
| Standard indicators           | Yes                 | 101          | 82          | 2.463 (1.191–5.095) | 1.273 (0.489–3.316) | 0.622    |
|                               | No                  | 13           | 26          | 1^R         | 1^R     |
| Facility type                 | Health center       | 54           | 28          | 3.037 (1.660–5.559) | 2.499 (1.059–5.897)^* | 0.037^*  |
|                               | Hospital            | 20           | 17          | 1.853 (0.868–3.955) | 0.999 (0.310–3.222) | 0.998    |
|                               | Health post         | 40           | 63          | 1^R         | 1^R     |
| User friendly report format   | Present             | 102          | 76          | 3.579 (1.730–7.404) | 1.771 (0.682–4.599) | 0.240    |
|                               | Absent              | 12           | 32          | 1^R         | 1^R     |
| Trained person able to fill formats | Present     | 99           | 75          | 2.904 (1.471–5.733) | 2.474 (1.124–5.445)^* | 0.024^*  |
|                               | Absent              | 70           | 83          | 1^R         | 1^R     |
| Feed-back                     | Received            | 86           | 51          | 3.433 (1.942–6.068) | 3.083 (1.549–6.135)^* | 0.001^*  |
|                               | Not received        | 28           | 57          | 1^R         | 1^R     |
| Supervision                   | Received            | 96           | 76          | 2.247 (1.171–4.307) | 1.351 (0.620–2.943) | 0.450    |
|                               | Not received        | 18           | 32          | 1^R         | 1^R     |
| Internet access               | Yes                 | 44           | 25          | 2.087 (1.163–3.746) | 0.610 (0.268–1.388) | 0.238    |
|                               | No                  | 70           | 83          | 1^R         | 1^R     |

COR-Crude Odds Ratio, AOR-Adjusted Odds Ratio, 1^R – Reference category * P-value < 0.05 from multivariate analysis.

Discussion
The accuracy of data in this study was found to be 129 (58.1%) and it was less than the accuracy of data reported from Hadiya zone, Southern region of Ethiopia where seventy six percent of the departments at the health center had accurate data (16) and 79% in Nigeria (34). The difference might be because of the difference in the type of facilities and level of the feedback provided to the departments in which 95.8% of the departments at Hadiya zone (16) and 61.7% of the departments at Harari region received the feedback. Also, the interval of verification factor used to measure the data accuracy in Nigeria was wider (0.85–1.15) (34) than the verification factor interval used in this study (0.9–1.1) to measure the data accuracy. Generally, data accuracy can be affected by errors that occur during data entry, intentionally manipulating the data for different reasons like competition among staffs and facilities, false report to increase achievement, and reports not made on time.

In this study, the 69.6% registration (source document) content completeness was lower than the 93% report content completeness. This is supported by the recently published study which was conducted in East Wollega where the 78.2% registration content completeness was less than the 86% report content completeness indicating that the health workers focus on managing patients rather than recording data due to the work load and lack of commitment to the data(35).

The 93.7 percent timeliness of the data revealed in this study was closer to the one reported in the data quality review conducted by the Ethiopian public health institute which was 100% data timeliness in Harari Region (17) but higher than the timeliness reported from the other parts of Ethiopia-70% in East Wollega and 89% in West Wollega (36). The easy accessibility of the health facilities in the Harari Region is the possible explanation for the difference observed.

The result of the study revealed that near half (51.35%) of the departments implementing routine health information system have good levels of data quality. This is similar with the findings from many developing countries that the data quality falls between 34–72% (9). However, it is lower than the one from the
study conducted in Dire Dawa which reported three fourth (75.3%) level of good quality data (14). This might be because of the difference in the way the dimensions of the data quality were measured in Dire Dawa in which the completeness was measured in-terms of the report completeness while in this study the completeness was measured in-terms of both the registration content completeness and report content completeness. It might also be attributed to the effect of Corona Virus Disease (COVID-19) on the health information system performance including data quality because this study was conducted while the COVID-19 is challenging the health system as in general.

The departments that were found in the health centers were 2.5 times more likely to have good quality data than the departments found in the health posts. This is evident by the findings from the pioneering regions of Ethiopia in which the data quality was better at the health centers and hospitals than at the health posts (37). The low level of education among the staffs at the health posts (all are diploma holder and below), the larger amount of data collected by limited number of health extension workers and lack of HMIS personnel who closely monitor the data quality as compared to the health centers and hospitals are the possible reasons for the variation. It might also be due to the more attention given by the government and other stake holders for the health centers through HMIS capacity building and mentorship.

The departments that have trained personnel able to fill the formats were 2.5 times more likely to have good quality data as compared to the departments that do not have the trained person whereas the presence of feed-back was significantly associated to the good quality data with the AOR = 3.083; 95%CI: 1.549–6.135. This was supported by the study conducted in Dire Dawa where the presences of trained staffs and feed-back were significantly associated to the data quality with AOR = 2.25; 95%CI: 1.082–4.692 and AOR = 2.48; 95%CI: 1.262–4.846 respectively (14). Training can make clarity on the issues of HIS related activities and tools and increases familiarity with the HIS tools such as registers, reporting formats and information communication technology soft wares.

Although supportive supervision showed association to the data quality on bivariate logistic regression, it was not significantly associated to the data quality on multivariate logistic regression in this study. This was different from the finding of the study conducted in Gurage Zone in which the supervision was associated to the community health information system performance (data quality and use) (27). The difference might be attributed to the quality of supervision as noted from Tanzania (21). The other possible justification is that in most practical cases, supervision is just to find fault rather than being supportive supervision. But, it is the supportive supervision which helps the departments to fill their gap in data recording, processing, analyzing, reporting and data quality checking.

The limitations of this study were that it was unable to show the consistency between the data in the routine health information system and that same data in the real-world since the study addressed only the three dimensions of data quality. Future studies should incorporate qualitative studies to have a deeper insight on the behavioral factors that influence data quality.

**Conclusion**

The level of good data quality among the departments in the public health facilities of Harari region was less than the 80% expected national level. The refreshment training given to the staff was very low. The type of facility, lack of trained personnel able to fill the formats, and the feedback were the factors that significantly associated with the data quality on both bivariate and multivariate logistic analysis and affect the data quality. Continuous refreshment in-service HMIS related training should be arranged and provided by Harari Regional health bureau and other stakeholders to increase the knowledge and skills of the health workers. It is also better for the supervisors at different levels of the Harari region particularly woreda health offices to provide supportive supervision focusing on the data quality and provide feedback to the departments regularly.

**Abbreviations**

HIS: Health Information System; HMIS: Health Management Information System; PRISM: Performance of Routine Information System Management; WHO: World Health Organization

**Declarations**

**Ethics approval and consent to participate**

Ethical clearance and approval was obtained from the Haramaya University, College of Health and Medical Sciences Institutional Health Research Ethical Review Committee (IHRERC). The college of Health and Medical Sciences wrote an official letter to the Harari Regional Health Bureau and a co-operation letter was written from the Harari Regional Health Bureau. Informed, voluntary, written and signed consent was obtained from each health facility’s managers and study participants to start data collection. The collected data were kept confidential without the names of the study participants.

**Consent for publication:**

Not applicable.

**Availability of data and materials**

The data sets used and/ or analyzed during the current study are available from the corresponding author on reasonable request.

**Competing interests**

The authors declare that they have no competing interests.
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Authors’ contributions

AT contributed to designing the work, data acquisition, data analysis and interpretation, and also manuscript preparation. NB was actively involved in the design of the work and critically reviewed the work for important intellectual content. HS designed the work and edited the proposal. AA was involved in the design of the work and reviewed the document. All authors have read and approved the manuscript.

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References

1. World Health Organization (WHO). Everybody’s Business : Strengthening Health Systems to Improve Health Outcomes : WHO’s FrameWork for Action. https://www.who.int/healthsystems/strategy/everybodys_business.pdf. Accessed on 11/1/2019. 2007.

2. Measure Evaluation. Routine Health Information Systems: A Curriculum on Basic Concepts and Practice, Facilitators’ Guide. [Internet]. https://www.measureevaluation.org/resources/publications/sr-16-135b. Accessed on 11/24/2019 5:29 PM. 2017.

3. Ministry of Health (MOH). HMIS Information Use Guide Technical Standards Area 4: Version 2. HMIS scale-up project. Federal Democratic Republic of Ethiopia. [Internet]. https://www.measureevaluation.org/resources/publications/ms-13-70. Accessed on 10/30/2019 9: 54 AM. 2013.

4. Yarimbab TE, Assefa MK. Utilization of HMIS Data and Its Determinants at Health Facilities in East Wollega Zone, Oromia Regional State, Ethiopia: A Health Facility Based Cross-Sectional Study. Journal of Medical and Health Sciences. 2018; Volume 7, issue 1.

5. Ministry of Health (MOH). HSTP (Health Sector Transformation Plan): 2015/16 - 2019/20 (2008-2012 EFY). [Internet]. https://ehia.gov.et/sites/default/files/Resources/HSTP%20Final%20Print%202015-11-27%20Print%20size.pdf. Accessed on 2/28/2017 12:46 PM. 2015.

6. Drobac PC, Basinga P Condo J, Farmer PE, Finnegan KE, Hamon JK, et al. Comprehensive and integrated district health systems strengthening: the Rwanda Population Health Implementation and Training (PHIT) Partnership. BMC Health Services Research. 2013;13.

7. Kumar M, Gotz D. System Design Barriers to HIS Data Use in Low and Middle-income Countries: A Literature Review. UNC SILS Technical Report 2016-01. [Internet]. https://silis.unc.edu/sites/default/files/general/research/UNCSILS-TR-2016-01.pdf accessed. Accessed on 10/21/2019. 2016.

8. Lippeveld T. Routine Health Facility and Community Information Systems: Creating an Information Use Culture. Global Health: Science and Practice 2017;5:338-40.

9. Belay H, Lippeveld T. Inventory of PRISM framework and tools: application of PRISM tools and interventions for strengthening routine health information system performance. Chapel Hill, NC: MEASURE Evaluation. https://www.measureevaluation.org/resources/publications/wp-13-138. Accessed January 3, 2020. 2013.

10. Rowe AK. Potential of Integrated Continuous Surveys and Quality Management to Support Monitoring, Evaluation, and the Scale-up of Health Interventions in Developing Countries. Am J Trop Med Hyg. 2009;80(6):971–9.

11. Mate KS, Bennett B, Mphatswe W, Barker P, Rollins N. Challenges for Routine Health System Data Management in a Large Public Programme to Prevent Mother-To-Child HIV Transmission in South Africa. PLoS One. 2009;4 (5):e5483.

12. Mutale W, Chintu N, Amoroso C, Awoonor-Williams K, James Phillips S, Baynes C, et al. Improving health information systems for decision making across five sub-Saharan African countries: implementation strategies from the African Health Initiative. BMC Health Serv Res. 2013;13.

13. Mbondji PE, Kebede D, Soumby-Alley EW, Zielinski C, Kouvidilia W, Lusamba-Dikassa P-S. Health Information Systems in Africa: Descriptive Analysis of Data Sources, Information Products and Health Statistics. Journal of the Royal Society of Medicine. 2014;107:34-45.

14. Teklegiorgis K, Tadesse K, Mirute G, Terefe W. Level of Data Quality from Health Management Information Systems in a Resources Limited Setting and Its Associated Factors, Eastern Ethiopia’. South African Journal of Information Management. 2016;17(1):a612.

15. Kidane T, Ejigu G, Girma T. Assessment of Health Management Information System Implementation in Ayder Referral Hospital, Mekelle, Ethiopia. International Journal of Intelligent Information Systems. 2014; Vol. 3, No. 4:pp. 34-9.

16. Abera E, Daniel K, Letta T, Tsegaw D. Utilization of Health Management Information System and Associated Factors in Hadya Zone Health Centers, Southern Ethiopia. Research in Health Science. 2016;Vol.1, No. 2.

17. Ethiopia Public Health Institute (EPHI). Health Data Quality Review: System Assessment and Data Verification for Selected Indicators. [Internet].https://www.ephi.gov.et/images/pictures/download_2011/Ethiopia-Data-Quality-Review-DQR-report-2018.pdf. Accessed on 10/21/2019. 2018.

18. Ouedraogo M, Kurji J, Abebe L, Labonte R, Morankar S, Bedru KH, et al. A Quality Assessment of Health Management Information System (HMIS) Data for Maternal and Child Health in Jimma Zone, Ethiopia. PLoS ONE 2019;14(3).
19. World Health Organization (WHO). Improving Data Quality: A Guide For Developing Countries. https://apps.who.int/iris/handle/10665/206974. Accessed on 11/1/2019. 2003.

20. Bram JT, Warwick-Clark B, Obeysekere E, Mehta K. Utilization and Monetization of Healthcare Data in Developing Countries. Big Data. 2015;3:59–66.

21. Simba DO, Mwangu MA. Factors Influencing Quality of Health Management Information System (HMIS) Data the Case of Kinondoni District in Dares Salaam Region, Tanzania. East African Journal of Public Heath. 2006;3(1).

22. Misganu E, Abraham A, Emeket M, Sinafikish A, Temesgen K, Mekonnen S, et al. Understanding Performance Data: Health Management Information System Data Accuracy in Southern Nations Nationalities and People's Region, Ethiopia. BMC Health Services Research. 2019;19:175

23. Mucce EM, Odhiambo-Otieno GW, Kaburi LW, Kinyamu RK. Routine Health Management Information Use in the Public Health Sector in Tharaka Nithi County, Kenya. Imperial Journal of Interdisciplinary Research (IJIR). 2016;2.

24. Silas NK. Factors Influencing Performance of Routine Health Information System: The Case of Garissa Subcounty, Kenya. A master's Thesis, University of Nairobi. 2017.

25. Ahanhanzo YG, Ouedraogo LT, Kpozéhouen A, Coppieri M, Makoutodé M, Wilmet-Dramaix M. Factors Associated with Data Quality in the Routine Health Information System of Benin. Archives of Public Health. 2014.

26. Nwankwo B, Sambo MN. Can Training of Health Care Workers Improve Data Management Practice in Health Management Information Systems: A Case Study of Primary Health Care Facilities in Kaduna State, Nigeria. Pan African Medical Journal. 2018.

27. Tsedeke M. Community Health Management Information System Performance and Factors Associated with at Health Post of Gurge Zone, SNNPR, Ethiopia [Internet]. A Master's Thesis, University Of Gondar and Addis Continental Institute of Public Health. https://www.researchgate.net/profile/Tsedeke_Mathewos/publication/304567082_Community_health_management_information_system_Performance_a_ health. 2015.

28. Measure Evaluation. Tools for Data Demand and Use in the Health Sector: Performance of Routine Information System Management (PRISM) Tools. [Internet]https://www.measureevaluation.org/resources/publications/ms-11-46-d. 2011.

29. Orr K. Data quality and systems theory. Communications of the ACM. 1998;41(2):66-71.

30. Braa J, Heywood A, Sahay S. Improving Quality and Use of Data through Data-Use Workshops: Zanzibar, United Republic of Tanzania. Bulletin of the World Health Organization. 2012;90(5):379-84.

31. Central Statistical Agency (CSA). Population and Housing Census of Ethiopia. https://www.statsethiopia.gov.et/census-2007-2/. 2007.

32. Aqil A, Lippeveld T, Moussa T, Barry A. PRISM (Performance of Routine Information System Management) Tools User Guide. www.cpc.unc.edu/measure. 2012.

33. Gebrekidan M, Hajira M, Habtamu T, Negusu W, Dereje M, Fatoumata N-T. Data quality and Information Use: A Systematic Review to Improve Evidence in Ethiopia. African Health Monitor. 2012(14).

34. Adejumo A, Mathews V. An Assessment of Data Quality in Routine Health Information Systems in Oyo State, Nigeria. A master's Thesis, University of the Western Cape. http://hdl.handle.net/11394/5497. 2017.

35. Kebede M, Adeba E, Chego M. Evaluation of Quality and Use of Health Management Information System in Primary Health Care Units of East Wollega zone, Oromia Regional State, Ethiopia. BMC Medical Informatics and Decision Making. 2020.

36. Fikru ND, Dereje BD. Evaluation of HMIS Data Quality and Information Use Improvement for Local Action-Oriented Performance Monitoring in Beghi District in West Wollega, Oromia, Ethiopia. Journal of Health, Medicine and Nursing 2018;Vol.50.

37. Woldemariam H, Habtamu T, Fekadu N, Habtamu A. Implementation of an Integrated Health Management Information System and Monitoring and Evaluation (HMIS/M&E) system in Ethiopia: Progress and Lessons from Pioneering Regions. Quarterly health Bulletin 2010;3:48–52.

Figures
Figure 1
Level of data accuracy among departments found in different public health facility types of Harari Region, Ethiopia, 2020 (N=222)

Figure 2
Level of completeness of data among departments in different types of public health facilities in Harari Region, Ethiopia, 2020 (N=222).
Figure 3

Level of data timeliness among departments in public health facilities of Harari Region, Ethiopia, 2020 (N=222).

Figure 4

The level of data quality among departments found in different facility types of public health facilities in Harari Region, Ethiopia, 2020 (N=222).