Implementation and evaluation of a tele-education system for the diagnosis of ophthalmic disease by international trainees

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Abstract

Tele-education systems are increasingly being utilized in medical education worldwide. Due to limited human resources in healthcare in low and middle-income countries, developing online systems that are accessible to medical trainees in underserved areas potentially represents a highly efficient and effective method of improving the quantity and quality of the health care workforce. We developed, implemented, and evaluated an interactive web-based tele-education system (based on internationally accepted, image-based guidelines) for the diagnosis of retinopathy of prematurity among ophthalmologists-in-training in Brazil, Mexico, and the Philippines. We demonstrate that participation in this tele-education program improved diagnostic accuracy and reliability, and was preferred to standard pedagogical methods. This system may be employed not only in training, but also in international certification programs, and the process may be generalizable to other image-based specialties, such as dermatology and radiology.

Introduction

Medical education has undergone significant changes over the past decade with the integration of technology and online learning increasingly replacing physical lectures.¹⁻⁵ In fact, so-called massive open online courses (MOOCs) are in some cases changing the entire paradigm of higher education away from on-site classroom learning.⁶⁻⁹ These online curricula have several advantages including standardization of content across large audiences, the ability to be utilized remotely, lower cost, and decreased dependence on local expert human resources for teaching.^{5,10} While in wealthier countries, this may change the form of knowledge delivery, in countries with less-developed healthcare and educational infrastructures, access to online tele-educational resources can dramatically change not only the form, but the quality and quantity of the educational content available to local trainees. Most importantly, tele-education systems allow for access to high quality education without an immediate need for an increase in local expert human resources, which may be non-existent or otherwise too busy to devote time to education.^{11,12} Therefore, the pedagogical argument for development of international tele-education systems is strongest for those specialties where the human resources are the most limited and/or the content is the most challenging to teach.

Retinopathy of prematurity (ROP) is a leading cause of childhood blindness worldwide.¹³ ROP care is clinically challenging and resource intensive. In the United States, despite a relative abundance of ophthalmologists and neonatologists compared to most of the world, there remain challenges to meeting the needs of ROP education as well as clinical care.¹⁴⁻¹⁶ Worldwide, this paucity of trained ROP providers is even more extreme in middle-income countries, where advancements in neonatal survival for preterm babies are resulting in increasing numbers of infants developing ROP.¹³ Moreover, accurate diagnosis of ROP can be challenging and many studies have demonstrated poor inter-examiner reliability, especially among providers with less experience, which raises serious concerns about the quality of care in medically underserved areas.^{14,16,17}

Tele-education can improve the exposure to and standardization of ROP education, and has potential to improve diagnostic competency of ophthalmology trainees worldwide. We developed an interactive tele-education system for ROP education and implemented this system at ophthalmology training programs in Brazil, the Philippines and

Mexico. The purpose of this project was to determine the efficacy and trainee satisfaction of a remotely implemented ROP tele-education system. This system has potential to improve the quality and widespread delivery of ROP education and therefore indirectly (but significantly) improve the quality of medical care particularly in medically underserved areas throughout the world. Furthermore, this study demonstrates validation of principles that may be generalizable to other medical specialties, particularly ones that rely heavily on image-based diagnosis such as dermatology and radiology.

Study Domain

ROP is an ocular disease that develops in low birth weight and low gestational age infants, affecting approximately 14,000-16000 children in the United States per year.¹⁸ Diagnosis requires accurate recognition of disease, which has been classified by international guidelines established to triage these infants into one of several categories: no ROP, mild ROP, moderate ROP, and severe (treatment-requiring) ROP.¹⁹ Approximately 90% of infants who develop ROP will have only mild or moderate disease and will require follow-up examinations every 1-2 weeks for the first few months of life.^{18,20} However, approximately 10% of patients will progress to severe ROP. For these latter infants, treatment with laser photocoagulation or intraocular injection of pharmacological agents has been shown to successfully prevent blindness in most cases.^{18,20} Therefore, diagnostic accuracy of ROP that is high risk for requiring treatment is critical for preventing pediatric blindness.

Methods

The Weill Cornell Medical College (WCMC) and the Oregon Health & Science University (OHSU) Institutional Review Boards approved all aspects of the use and analysis of retinal images and educational material used in this study. Administration and analysis of the tele-education system was also reviewed by the WCMC Institutional Review Board, and was granted an exemption because it was considered research in an established or commonly accepted educational setting involving normal educational practices such as research on the effectiveness of instructional techniques, curricula, and instructional strategies. This study was conducted in adherence all federal and state laws and was in accordance with Health Insurance Portability and Accountability Act (HIPAA) guidelines.

Development of the Retinopathy of Prematurity Tele-education system

A secure web-based tele-education system was developed utilizing a repository of over 15,000 images captured from routine ROP exams. The system was coded in C# on the ASP.NET platform (Microsoft; Redmond, WA), and employed a SQL Server database. To facilitate software development and compatibility across different web browsers, the system was developed using an open source JavaScript wrapper (jQuery; Mozilla; Mountain View, CA). Modules were developed in both English and Portuguese.

Tele-education system content and procedures

Figure 1 demonstrates the procedure for the tele-education system, which consisted of four unique sections: (1) Pretest examination; (2) ROP tutorial; (3) ROP training chapters; (4) Post-test examination. Clinical cases were presented in the Pre-test examination, ROP training chapters, and the Post-test examination. Each case included relevant clinical demographics and retinal images of both eyes. (**Figure 1A**). Trainees were required to enter a diagnosis for all image-based characteristics of ROP as defined by an internationally standardized classification system: plus disease (no, pre-plus, plus), zone (I, II, III), stage (1-5), category (no ROP, mild ROP, moderate ROP, severe treatment-requiring ROP), and aggressive posterior-ROP (APROP) for each individual eye. For the purposes of this study, the primary outcome measure was the overall disease category: presence of mild-or-worse, moderateor-worse, or severe (treatment requiring) ROP.

Sections 1 and 4: Pre-test / Post-test. At baseline, and following the completion of the ROP training chapters each trainee completed a set of 20 clinical cases with various degrees of ROP. 16/20 cases (80%) were unique and 4 (20%) were repeated to measure intra-grader reliability. Completed cases could be reviewed but not changed during the testing and no feedback was provided.

Section 2: ROP Tutorial. Following the pre-test examination, trainees completed a tutorial on ROP diagnosis and management designed by the co-authors (RVPC, KEJ, SO, MFC). The ROP tutorial included didactic information on the different classifications of ROP and pertinent management considerations (treatment, follow-up time). When trainees were in between different chapters, the ROP tutorial was available as a reference for clarification, but the

tutorial was not available while trainees were in the pre-test or post-test examinations, or within a ROP training chapter.

Section 3: ROP Training Chapters. After completing the ROP tutorial, trainees were asked to complete five training chapters, each consisting of five clinical cases. Within each training chapter, trainees were given immediate feedback on their accuracy (Figure 1B) and targeted supplemental educational material was provided for any incorrect answers in four ways (Figure 1C): (1) Review of the image for which an incorrect response was provided; (2) Annotated images from the case that highlights the specific pathology; (3) Additional annotated images selected by the program from the database of validated images of other cases that highlight the specific pathology and; (4) Images that highlight the specific pathology corresponding to the (incorrect) chosen response. After reviewing the automated feedback based on their specific responses, trainees could then proceed to the next clinical case within the training chapter. After completing each chapter, trainees had the option to: (1) Proceed to the next chapter or section; (2) Review the ROP tutorial; (3) Review their responses and feedback from previous training chapters.



Figure 1. ROP Tele-education system procedures. (A) demonstrates progression through the course (pre-test examination, ROP tutorial, training chapters, and post-test examination), and displays a sample clinical case. In the training chapters, following the selected diagnosis, trainees were provided immediate feedback (B) and targeted supplemental tutorial and review (C).

Consensus Reference Standard Diagnosis

To ensure accuracy in the educational content, particularly because of potential variability in diagnosis among physicians,²¹⁻²³ a reference standard ROP diagnosis was determined for each case by consensus of three experts and the clinical diagnosis. This was done using previously-described methods: (1) The clinical diagnosis (based on complete ophthalmic exam by an experienced examiner) was recorded; (2) Each set of retinal images was interpreted by 3 experienced readers using a web-based system; (3) The image-based diagnosis that was selected by the majority of image readers was then compared to the clinical diagnosis.²⁴ When these two diagnoses are the same, it was defined as the consensus reference standard diagnosis. When the diagnoses are different, all of the data were reviewed by two of the investigators (RVPC, MFC) along with two study coordinators (KEJ, SO), and a consensus reference standard was determined. This consensus reference standard diagnosis was then used for the purposes of this current study.

Study Population

Ophthalmologists in training were recruited by the co-authors (KEJ, RVPC, RA, CVV, MAMC) from training programs in Brazil, Mexico, and the Philippines. Ophthalmology trainees in all years were allowed to participate in the ROP tele-education system. At one program, a control group was provided the pre-test examination, followed by the post-test examination to be taken at least one month after the pre-test examination (to prevent immediate recall), but was not given access to the ROP tutorial or ROP training chapters. At this program, trainees were randomized 1:1 to participate in the program as part of the control group or take the tele-education system as indicated in **Figure 1**.

Survey

A survey was designed using a publicly available service (http://www.SurveyMonkey.com). Six questions were adapted from existing psychometric instruments to measure trainees' attitudes using a 5-point Likert-type scale (1=strongly disagree, 2=disagree, 3=neutral, 4=agree, 5=strongly agree); one additional question allowed for free-text comments. Questions were reviewed by the authors for face validity and content validity and modified until all authors were satisfied with the survey instrument. Of the six questions, two assessed the trainees' perception of their understanding of the diagnosis of ROP, three assessed the trainees' attitudes toward preferred learning environment, and one assessed the trainees' opinion of ease of use of the ROP tele-education system. All participants were invited to complete the survey.

Statistical Analysis

The main outcome measure was the post-ROP tele-education program sensitivity (compared to the pre-program sensitivity) of diagnosing any ROP (mild-or-worse ROP). The sensitivity and specificity of each disease category (mild-or-worse, moderate-or-worse, and severe) was measured before and after participation in the program. Sensitivities and specificities were compared using the paired t-test for each program and for all trainees as a single cohort, and by program, and statistical significance was considered to be a 2-sided P value <.05. For the training program with a control group, a secondary outcome measure included change in sensitivity of "active" education vs. control for each disease category. Data were analyzed using the R statistical software platform.²⁵ Sensitivity and specificity values were calculated using the caret package.²⁶ Based on the 4 cases that were repeated in both the pretest and post-test examination, intra-grader reliability was evaluated using the kappa (κ) statistic for chance-adjusted agreement in diagnosis. Cohen's Kappa values were calculated using the irr package,²⁷ and figures were generated using the ggplot2 package.²⁸ A well-known scale was used for interpretation of results: 0 to 0.20, slight agreement; 0.21 to 0.40, fair agreement; 0.41 to 0.60, moderate agreement; 0.61 to 0.80, substantial agreement; and 0.81 to 1.00, almost-perfect agreement.²² Descriptive statistics were used to summarize the trainees' responses to the post-ROP tele-education program web-based survey. The non-parametric Wilcoxon signed-rank test was used to compare the trainees' pre- and post-ROP tele-education program perception of their understanding of the diagnosis of ROP.

Results

Characteristics of Study Population

Table 1 summarizes key characteristics of the three training programs and study participants. 92 ophthalmologistsin-training were provided access to the ROP tele-education program among the three programs, and 8 completed the program: 27 at program 1 (with 26 randomized to control), 43 at program 2, and 11 at program 3. None of the training programs involved have a formal ROP curriculum to assess clinical competency of graduates, but all programs had some exposure to ROP, and trainees were familiar with interpreting wide-angle retinal images such as those used in the program.

Table 1. Study population				
Program Characteristics	Program 1	Program 2	Program 3	
Number of trainees in program	58	54	11	
ROP Curriculum (Y/N)	Ν	Ν	Ν	
Access to wide-angle camera (Y/N)	Y	Y	Ν	
Premature infants per year examined by faculty	94	94 350		
Trainee Characteristics				
Number completed program (%)	27*	43	11	
Mean Age in Years (SD)	27 (1.2)	28 (2.5)	34 (2.8)	
Gender				
Male, n (%)	13 (48)	12 (28)	5 (45)	
Female, n(%)	14 (52)	31 (72)	6 (55)	
Training year				
1st Year, n (%)	7 (26)	19 (44)	3 (27)	
2nd Year, n (%)	8 (30)	15 (35)	2 (18)	
3rd Year, n (%)	7 (26)	9 (21)	4 (36)	
4th Year / Fellow, n (%)	5 (19)	N/A	2 (18)	

*26 others participated as controls

Accuracy of ROP Diagnosis among Participants and Controls in the ROP Tele-education Program

Table 2 summarizes the pre- and post-ROP education program sensitivity and specificity for the diagnosis of ROP. The pre-test sensitivity of detecting mild-or-worse ROP was 81% (SE), which improved to 93% (SE) following the program, P < 0.001. There were statistically significant increases in sensitivity and specificity in all diagnostic categories. In subgroup analysis by program, these trends persisted with increases in sensitivity and specificity in each case.

Table 2. Accuracy of retinopathy of prematurity (ROP) diagnosis in the participants in the ROP teleeducation program.

POP Disease Category	Sen	sitivity, % (SE)	Specificity, % (SE)			
KOF Disease Calegoly	Pretest	Posttest	P value	Pretest	Posttest	P value	
All programs (N=81)							
Mild or worse	81 (2)	93 (1)	<0.001	69 (4)	88 (2)	<0.001	
Moderate or worse	71 (3)	79 (2)	< 0.002	79 (3)	90 (1)	<0.001	
Severe (treatment requiring)	55 (4)	66 (4)	< 0.022	79 (2)	89 (1)	<0.001	
Program 1 (N=27)							
Mild or worse	83 (3)	95 (1)	<.001	81 (5)	94 (2)	<.001	
Moderate or worse	67 (5)	81 (3)	0.003	88 (3)	92 (1)	0.18	
Severe (treatment requiring)	54 (6)	71 (6)	0.012	85 (3)	89 (2)	0.27	
Program 2 (N=43)							
Mild or worse	80 (3)	92 (1)	<.001	59 (6)	83 (3)	<.001	
Moderate or worse	73 (4)	81 (2)	0.111	71 (4)	88 (2)	<.001	
Severe (treatment requiring)	57 (6)	62 (5)	0.452	74 (3)	89 (2)	<.001	
Program 3 (N=11)							
Mild or worse	78 (7)	90 (3)	0.176	81 (9)	95 (3)	0.176	
Moderate or worse	73 (7)	82 (4)	0.377	84 (6)	89 (3)	0.182	
Severe (treatment requiring)	48 (10)	66 (11)	0.343	81 (3)	89 (4)	0.112	

ROP, retinopathy of prematurity; SE, standard error.

Table 3 demonstrates the change in sensitivity and specificity among the population of trainees randomized to participate in the program versus the control. In the control group there was no change in the sensitivity of detecting of mild-or-worse disease (P = 0.708), the main outcome measure.

ROP Disease Category	Sen	sitivity, % (SE)	Specificity, % (SE)			
	Pretest	Posttest	P value	Pretest	Posttest	P value	
Tele-education group (N=27)							
Mild or worse	83 (3)	95 (1)	<.001	81 (5)	94 (2)	<.001	
Moderate or worse	67 (5)	81 (3)	0.003	88 (3)	92 (1)	0.18	
Severe (treatment requiring)	54 (6)	71 (6)	0.012	85 (3)	89 (2)	0.27	
Control (N=26)							
Mild or worse	82 (4)	84 (3)	0.708	79 (5)	79 (5)	0.932	
Moderate or worse	70 (5)	78 (4)	0.023	85 (3)	84 (4)	0.899	
Severe (treatment requiring)	53 (7)	64 (7)	0.112	80 (3)	79 (3)	0.846	

Table 3. Accuracy of retinopathy of prematurity (ROP) diagnosis in the trainees randomized to active tele-education and control at Program 1.

ROP, retinopathy of prematurity; SE, standard error.

Intra-Grader Agreement among Participants in the ROP Tele-education Program

Table 4 demonstrates the kappa statistics for intra-grader agreement among participants in the pre-test and post-test examinations of the ROP tele-education program. For the detection of mild-or-worse ROP among all participants (N=81), the kappa increased from moderate (0.57) to substantial agreement (0.8), with similar trends in every program and disease category. In the control group (N=26), the kappa also increased from 0.59 to 0.75, demonstrated improved intra-grader agreement with repeated testing over time, even without access to ROP tele-education program. 24 / 26 (92%) of control trainees waited the requested month between the pre-test and post-test examinations.

Table 4. Kappa statistics for intra-grader agreement participants and controls in the pretest and posttest of the retinopathy of prematurity tele-education program

ROP Disease Category	All Programs (N=81)		Program 1 (N=27)		Program 2 (N=43)		Program 3 (N=11)	
	Pretest	Posttest	Pretest	Posttest	Pretest	Posttest	Pretest	Posttest
Mild or worse	0.57	0.8	0.64	0.83	0.46	0.78	0.73	0.81
Moderate or worse	0.47	0.75	0.62	0.77	0.33	0.74	0.53	0.72
Severe (treatment requiring)	0.39	0.64	0.38	0.63	0.42	0.64	0.13	0.65

ROP, retinopathy of prematurity.

POST-RETINOPATHY OF PREMATURITY TELE-EDUCATION PROGRAM SURVEY OF TRAINEES

31 of the 81 trainees (38%) who completed the ROP tele-education program also completed the post-program survey. Figure 2 shows the results of this survey. With a maximum score of 5 for each question, the average score for each question was calculated. The average score for question 1 (adequate understanding of ROP before the tele-education system) was 2.4/5, as only 5 (16%) of the respondents agreed or strongly agreed that they had an adequate understanding of ROP diagnosis before taking the ROP tele-education program. Following the program, the respondents' score averaged 4.3/5 suggesting that they felt their knowledge significant improved through the program (signed-rank test; P<.01). 31 / 31 (100%) of the respondents agreed or strongly agreed that they had an adequate understanding of the diagnosis of ROP after completing the ROP tele-education program. The average score for question 2 (ROP tele-education was easy to use) was 4.2/5 as 29 (94%) of the respondents agreed or strongly agreed that the end of cases was helpful (question 3). For question 6 (preference for interactive system over textbook learning), the average

score was 4.2/5 as 29 (94%) respondents agreed or strongly agreed that they learned more effectively with the automatic feedback opposed to textbook learning.



Figure 2. Survey results of trainees who completed the retinopathy of prematurity (ROP) tele-education program (N = 31).

Discussion

Summary of Key Findings

We report the effective use of a tele-education system for teaching a clinically challenging ophthalmic disease in middle-income countries. We validate the concept that for image-based diagnosis, an internet-based tele-education system can be effective and preferred to more traditional educational models. The key findings from this study are: (1) This ROP tele-education system significantly improved the diagnostic accuracy and reliability of ophthalmology trainees. (2) Participants found the ROP tele-education system easy to use and they felt that they learned more effectively from ROP cases with automatic, targeted error-based feedback compared to a traditional textbook format.

Implications for Retinopathy of Prematurity Care and Telemedicine

These results demonstrate that a web-based tele-education system can be effective at improving the diagnostic accuracy for ROP for ophthalmology trainees in Brazil, Mexico, and the Philippines. Following completion of the course, trainees demonstrated 93% sensitivity at detecting mild-or-worse ROP, 71% sensitivity at detecting moderate disease, and 66% sensitivity at identifying severe (treatment-requiring) disease. To put this in perspective, these trainees outperformed a cohort of US pediatric ophthalmology fellows (85%, 53%, and 52% sensitivity for identifying mild, moderate, and severe disease, respectively) who completed ophthalmology training in the United States, but who did not complete this tele-education system.¹⁶ Additionally, participants in the tele-education program demonstrated improved intra-grader reliability of diagnosing ROP from "fair" or "moderate" to "substantial" agreement for all subtypes, including treatment-requiring ROP. These results are particularly significant in the diagnosis of ROP, in which despite the presence of international evidence-based, image-based guidelines, the literature consistently reports poor intra-rater and inter-rater reliability in ROP even among experts.^{21,22,29,31} As the routine care delivery model for ROP moves towards the use of telemedicine for screening and referral,³² the success of any telemedicine program will be dependent on the accuracy and reliability of the graders.³³ Thus, though there remains room for improvement, particularly at recognizing moderate and severe ROP, as a pilot implementation of a tele-education system these results are extremely encouraging.

Implications for International Tele-Medical Education

The lack of human resources is perhaps the most critical factor limiting improvements in health care education and delivery in low and middle-income countries. In the US there is approximately one ophthalmologist for every 10,000 persons.³⁴ In India, the number is closer to 1:100,000, and in most parts of Sub-Saharan Africa, it is less than 1:1,000,000.^{13,34,35} Compounding the human resource problem, among medical trainees in low and middle-income countries, access to quality medical education remains limited, and the ability to become well trained in the management of a complex disease such as ROP can be difficult. Even in the United States, ROP education has its challenges, as US trainees generally do not feel well qualified to perform ROP care independently without additional training.¹⁴⁻¹⁶ In middle-income countries where the number of cases of ROP is rising, the current medical education system has not been able to train enough qualified providers to manage emerging epidemic.¹³ Thus, a tele-education

system that can be accessed from anywhere in the world that can demonstrate significant improvement in diagnostic accuracy and reliability has the potential to greatly impact the quality of ROP care, and mitigate the incipient rise in pediatric blindness in these countries. Moreover, these results suggest that a similar model could be used for other medical specialties that rely primarily on image-based diagnosis, such as dermatology,^{36,37} pathology,³⁸ radiology,³⁹ and cardiac electrophysiology and echography.^{40,41}

In addition to being utilized to *improve* diagnostic performance among trainees and practitioners, a similar webbased interactive system could be used to *standardize* and *certify* medical specialists for any of these specialties. The development of this web-based training system utilized a novel method for validating the reference diagnosis for each image against which trainees could be evaluated.²⁴ Compared to traditional examinations with a limited number of testable images, and no intra-test interaction with the test-taker, there is tremendous potential for an interactive web-based system with thousands of validated images not only to assess clinical competency but to improve the accuracy and reliability of participants, and thereby improve the quality of "certified" care providers around the world.

Limitations

There are several limitations that should be mentioned. First, due to small numbers limiting statistical power, we were only able to randomize participants into a control group at one of the three training programs, and we were not able to include a control group based on more traditional pedagogical methods, such as textbook chapters and classroom lectures. Presumably, traditional methods of learning can provide similar results. That said, none of these programs currently have an established curriculum (nor do, for that matter, most US programs),¹⁵ and we have demonstrated that providing remote access to this tele-education system can markedly improve diagnostic performance, exceeding that of US graduates, with limited local effort or resources.^{15,16} Second, in this pilot study, we did not attempt to determine the common diagnostic errors that led to incorrect responses. Third, we are unable to estimate whether a longer program or some modification of this program would perform better, or a shorter program perform equivalently. Fourth, though we did include a Portuguese system for the Brazil group, we relied on the common familiarity with medical English in Mexico and the Philippines. It is possible that these results may not easily translate when multiple translations are required for other countries and languages. We plan to investigate these questions in future studies.

Conclusions

In summary, we demonstrate that participation in this ROP tele-education system can increase diagnostic accuracy and reliability among trainees in Brazil, Mexico, and the Philippines.¹⁶ Program participants found the web-based, interactive system easy to use, and preferable to traditional learning methods. These results provide evidence that tele-education may be an effective modality to improve diagnostic performance in ophthalmologic disease, and particularly in middle-income countries, where there is an emerging epidemic, tele-education may represent a key strategic intervention to improve the quantity and quality of ROP care providers without added burden to existing local human and educational resources. As telemedicine and tele-education approaches to clinical care and education become more mainstream, we believe that these results may be generalizable to other medical specialties which rely on image-based detection of disease using international standards.

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