Title: Development and Refinement of a Learning Health Systems Training Program

Nicholas G. Wysham
Duke University, nicholas.wysham@dm.duke.edu

Lynn Howie
Duke University, lynn.howie@gmail.com

Krish Patel
Duke University, krish.patel@dm.duke.edu

C. Blake Cameron
Duke University School of Medicine, blake.cameron@dm.duke.edu

See next pages for additional authors

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Abstract

Context: In the emerging Learning Health System (LHS), the application and generation of medical knowledge are a natural outgrowth of patient care. Achieving this ideal requires a physician workforce adept in information systems, quality improvement methods, and systems-based practice to be able to use existing data to inform future care. These skills are not currently taught in medical school or graduate medical education.

Case Description: We initiated a first-ever Learning Health Systems Training Program (LHSTP) for resident physicians. The curriculum builds analytical, informatics and systems engineering skills through an active-learning project utilizing health system data that culminates in a final presentation to health system leadership.

Findings: LHSTP has been in place for two years, with 14 participants from multiple medical disciplines. Challenges included scheduling, mentoring, data standardization, and iterative optimization of the curriculum for real-time instruction. Satisfaction surveys and feedback were solicited mid-year in year 2. Most respondents were satisfied with the program, and several participants wished to continue in the program in various capacities after their official completion.

Major themes: We adapted our curriculum to successes and challenges encountered in the first two years. Modifications include a revised approach to teaching statistics, smaller cohorts, and more intensive mentorship. We continue to explore ways for our graduates to remain involved in the LHSTP and to disseminate this program to other institutions.

Conclusion: The LHSTP is a novel curriculum that trains physicians to lead towards the LHS. Successful methods have included diverse multidisciplinary educators, just in time instruction, tailored content, and mentored projects with local health system impact.

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Authors
Nicholas G Wysham, Duke University; Lynn Howie, Duke University; Krish Patel, Duke University; C. Blake Cameron, Duke University School of Medicine; Gregory P Samsa, Duke University Medical Center; Laura Roe, Duke University Medical Center; Amy P Abernethy; Aimee Zaas, Duke University.

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Introduction

In the emerging Learning Health System (LHS), the application and generation of medical knowledge are a natural outgrowth of patient care. Achieving this ideal requires a physician workforce adept in information systems, quality improvement (QI) methods, and systems-based practice to be able to use existing data to inform future care. These skills are not currently taught in medical school or graduate medical education.

In response to this need, we initiated a first-ever Learning Health Systems Training Program (LHSTP) for resident physicians. The yearlong curriculum builds analytical, informatics, and systems engineering skills through an active-learning project that utilizes health system data and culminates in a final presentation to health system leadership. LHSTP has been in place for two years, with 14 participants from multiple medical disciplines.

This is a retrospective description of the development, implementation, early experience, feasibility, and acceptance with the Duke University LHSTP in its first two-year pilot phase. While we have had early successes, we also wish to highlight the obstacles we encountered and how we refined our approach in response. We hope this experience will be valuable to other educators as they consider similar endeavors.

The Physician’s Role in the Learning Health System

The LHS describes an environment where the application and generation of medical knowledge are a natural outgrowth of patient care. To realize this requires patient-level data gathering, real-time aggregation as well as analysis to prompt changes in delivery, to allow real-time outcomes evaluation, and to produce new best practices (Figure 1). As compared to the current paradigm wherein evidence from clinical research is applied unevenly and with great delay from the time of initial evidence generation, the LHS actively learns through the process of care delivery and can apply this knowledge rapidly to patient care. The LHS will require fundamental changes to health information management infrastructure, linkage of disparate health data sources, data quality improvements, creation of new decision support tools, and new ethical and legal frameworks concerning human subjects protections.

Reports emerging from early LHS projects demonstrate the promise of this ideal, but have been limited to narrow disease states or health conditions with highly engaged physicians. Scaling up this vision to encompass all patients and conditions within a health system holds tremendous promise, but also poses significant challenges.

Importantly, the LHS is not merely a technological exercise. It requires a supportive organizational structure and a skilled, highly engaged physician workforce. Just as the evidence-based medicine (EBM) movement required physicians to learn basic principles of research design to interpret and apply evidence, the LHS movement requires physicians to acquire additional skills to interact with emerging LHS information systems and to engage in true systems-based practice. These skills include the following:

1. Quality Improvement: methods of analysis and implementation;
2. Informatics: the use of data, information, knowledge, and technology in medicine;
3. Statistical reasoning: a basic understanding of statistical principles; and
4. Systems engineering and systems-based practice: an understanding of the systems in which the physician practices and how to change these systems.
Today’s physicians do not generally possess these skills. While programs to address this need are emerging for physician leaders, and quality improvement curricula are increasingly common, we are aware of no graduate medical education (GME) curriculum to teach a comprehensive learning health care skill set and viewpoint.

To best harness the promise of LHS, a culture change similar to the EBM movement is necessary. Because of the amount of clinical data and the diverse applications, a robust LHS needs a multitude of physicians from diverse clinical backgrounds to shape the process of data-driven continuous improvement. We recognized a need to equip future physicians with an understanding of these LHS methods and designed a curriculum to introduce these concepts so that our trainees could become leaders and catalysts in promoting the creation and application of the LHS.

**Case Description**

The Duke University LHSTP was created in 2013 with the help of grants from the Association of American Medical Colleges (AAMC) and Duke University Health System leadership (see acknowledgements). The program’s development was a collaborative effort, with cross-disciplinary engagement from biostatistics, biomedical informatics, quality improvement, and health system administration.

LHSTP leverages existing health-system data infrastructure. Duke Enterprise Data Unified Content Explorer (DEDUCE) is a web-based query tool for the Duke clinical data warehouse that has supported numerous research and quality improvement projects, and enables access to patient-level health data spanning three decades. Duke also had recently adopted and begun to optimize Epic—a unified electronic health record system (EHR), which
presented both a motivation to invest in the LHSTP and a use-case opportunity.

Trainees

Applications were solicited across the internal medicine residency and subspecialty fellowships for the first year. We admitted applicants who demonstrated understanding and commitment to the program’s goals, and those who could make a time commitment to be present at most didactic sessions. Six competitively selected internal medicine residents and subspecialty fellows formed the initial cohort. In general, they had some prior experience in quality improvement and limited research experience. Data skills and statistical knowledge were generally immature relative to their clinical expertise. The second cohort was larger, with eight trainees from diverse specialty backgrounds, including surgery and neonatology.

Curriculum

The yearlong LHSTP curriculum is delivered in two-hour sessions scheduled approximately every two weeks from the fall through the spring. Trainees are asked to attend in person, though due to realities of training house staff, we also record sessions for asynchronous web viewing.

The curricular framework is depicted in Figure 2. The elements were arrived at through a consensus among course leaders referencing published descriptions of the LHS.\textsuperscript{1–3} We surmised that the most effective way to teach the content would be to give an overview of the LHS goals, followed by the concepts underlying these aims (statistical reasoning, quality improvement methodologies). This is followed by an introduction to the available tools with which to apply these concepts (institutional data resources), which can be used toward their final product. We employ content experts to teach quality improvement methods, statistical methods, database design, and research methods, and to share local and national examples of LHS principles. The curriculum in its current form is outlined in Table 1.

In the spirit of active learning, the capstone of the curriculum is a group project presentation to the health system leadership. The key curricular challenge is developing the necessary skills to identify problems, to plan projects around them, and to begin work on these projects early in the year. Similarly, we have been challenged to overcome common limitations of clinical information systems and to provide the mentorship and ancillary support (e.g., statistical expertise) to make the most of the projects. As the year progresses, session time becomes more devoted to use-case examples of LHS concepts in action and active collaborative time to enhance their projects.

Statistical content is delivered by a PhD-level statistician with expertise in adult learning and in teaching physicians and other health care practitioners.\textsuperscript{7} We found the most effective way to deliver the statistical content revolved around the construction of an appropriate database. The training focuses on how to frame clinical questions and answer them using descriptive statistics and data visualization tools. Formal hypothesis testing and inferential statistics are de-emphasized. This reflects a focus on rapid-cycle quality improvement, which is philosophically distinct from inferential statistics, instead focusing on important observed trends.

One particularly valuable exercise is to have trainees implement these concepts by constructing a small (five-patient) “minidatabase” around a clinical question of their choice. While the goal of the LHS is to operate at scale, clinical trainees are often unfamiliar with the characteristics of the available structured clinical data. Having them begin with a small sample is intended to reinforce several skills:
framing an appropriate clinical question, designing a data set that adequately addresses that question, developing a search strategy, getting and cleaning data, and reporting results using data visualization software. Once familiar with the relevant data, trainees are able to more effectively communicate their needs to data managers and statisticians for the final project.

**Findings**

**Trainee Experience**

To evaluate the need for program changes in the third year, satisfaction with LHSTP was assessed by an anonymous survey emailed midway through the second year. Eleven (79 percent) of 14 trainees responded. The majority (n=7; 64 percent) reported satisfaction with the program; three trainees (27 percent) were neutral. Most (n=9, 82 percent) trainees reported interest in the project topics. Only about half (n=6; 55 percent) felt contact with project mentors was adequate. At that time, half (n=5) would recommend the LHSTP to peers.

Qualitative feedback revealed that trainees had enrolled hoping to acquire quality improvement and statistical skills and to implement, rather than merely to plan, their projects. Several appreciated the current limitations of health information structures and data quality.

In a debriefing session at the conclusion of the second year, trainees expressed gratitude for the curriculum. Many wished to remain involved in the program in some capacity, and favored more mentored “over-the-shoulder” time for project work, rather than lectures, in the subsequent year. Their experience in their projects for the LHSTP had provided a new perspective, helping them realize the importance of accurate, structured clinical data. Some remarked that it changed the way they used the EHRs; they were more likely to enter structured data for problem lists, family history, and other fields.

**Final Presentations**

The curriculum culminates in a final presentation for health system leadership. The final topics were
### Table 1. Curricular Sessions and Goals

| TOPIC                                | OBJECTIVES                                                                 | FACULTY                                | ASSIGNMENTS                                      |
|--------------------------------------|-----------------------------------------------------------------------------|----------------------------------------|--------------------------------------------------|
| Introduction: What Is Learning Health? | Program introduction                                                        | AZ                                     |                                                  |
|                                      | LHS Concepts                                                               |                                        |                                                  |
|                                      | Project pitches                                                            |                                        |                                                  |
| Data Systems                         | Attributes of Data                                                          | NW, KP, BC, LR                         | Project Charter assigned                         |
|                                      | Introduction to data systems at Duke                                        |                                        |                                                  |
| Database                             | What is a database?                                                         | GS, Director of DEDUCE repository      | Final Project topic chosen                       |
|                                      | Setting up a database                                                       |                                        |                                                  |
|                                      | Introduction to DEDUCE                                                      |                                        |                                                  |
| Data Management                      | Introduction to REDCap                                                       | Director of Duke Office of Clinical Research | Present Aims section of project charter          |
|                                      | CRF creation                                                                |                                        |                                                  |
| Basic Statistics                     | Introduce statistical reasoning                                             | GS                                     | Present full project charter                     |
| Minichart review                     | Review progress                                                             | All                                    | Group presentations                              |
|                                      | Feedback on scope, data sources, outcomes                                  |                                        |                                                  |
| QI in health care – traditional QI models | Describe QI methodologies                                                   | Medical Director of Duke University Hospital Mortality and Quality Review |                                                  |
| QI versus LHS                        | Review conceptual similarities between QI and aims of LHS                   | GS                                     |                                                  |
|                                      | Highlight differences                                                       |                                        |                                                  |
|                                      | Statistical methods in learning health                                      |                                        |                                                  |
| Informatics                          | Describe clinical informatics                                               | BC                                     | “Work in Progress” update from groups           |
| Health Systems Engineering using the EHR | Describe a learning health project executed by faculty                      | Faculty member with expertise in learning health projects³ | Group project time                             |

Notes: DEDUCE = Duke Enterprise Data Unified Content Explorer; REDCap = Research Electronic Data Capture; CRF = case report form; QI = quality improvement; EHR = electronic health record; NIH BD2K = National Institutes of Health Big Data to Knowledge; HSR = Health Services Research; NIH = National Institutes of Health

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### Table 1. Curricular Sessions and Goals (Cont’d)

| TOPIC                     | OBJECTIVES                                                                 | FACULTY Assignment                                                                 | ASSIGNMENTS               |
|---------------------------|----------------------------------------------------------------------------|-------------------------------------------------------------------------------------|---------------------------|
| LHSTP frames of reference | Historical background to computational abilities of the LHS                | Faculty member with expertise in bioinformatics and funded NIH BD2K projects⁹        |                            |
| Data visualization        | Conceptual framework for working with, interpreting, and presenting longitudinal data | GS                                                                                   |                            |
| Longitudinal Data         | Conceptual framework for working with, interpreting, and presenting longitudinal data | GS                                                                                   |                            |
| Project Troubleshooting   | Open session for removing roadblocks for projects                           | All                                                                                  |                            |
| HSR                       | Describe traditional HSR and how the LHS can support research              | Faculty with HSR expertise¹⁰                                                              |                            |
| NIH Collaboratory         | Describe current national efforts to create data standards that will enable multisite LHS functions | Faculty with expertise in informatics¹¹                                              |                            |
| Practice Presentations    | Teams practice their final presentations                                    | Practice final presentation                                                            |                            |
|                           | Feedback for improvement                                                   |                                                                                      |                            |

**Notes:**
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diverse: (1) a robust analysis of trends in prolonged observational stays, sources of these admissions, and clinical predictors; (2) exploration of an association between maternal magnesium tocolysis for preterm labor and neonatal bowel perforations; (3) the value of individual components in an early recovery after surgery program; (4) appropriate sedation in intensive care units; and (5) appropriateness of deep venous thrombosis prophylaxis in an inpatient medicine unit.

The projects highlighted the key skills of learning health and curricular goals as previously outlined:

1. Quality Improvement: each project was chosen with input from health system leadership, based on a perceived gap in quality of care delivery.
2. Informatics: each project was a hands-on lesson in the clinical information systems available at Duke—highlighting strengths, weaknesses, and ways for improvement.
3. Statistical reasoning: each project used at least descriptive statistics; the choices of which statistic and the data collected, and visualization techniques, were informed by the curriculum.
4. Systems engineering and systems-based practice: while none of our projects evaluated clinical change, the lessons in data quality created better users of the EHR and opportunities for participants to help improve data quality in their respective clinical areas.

The final presentations ranged in quality and comprehensiveness, relating in large part to the analytical skills of the team members but also to the data sources available with which to answer their chosen questions. As an example, project 2 had difficulty identifying the appropriate control cohort and difficulty in identifying maternal-neonatal pairs within the EHR. By contrast, project 1 attempted derivation of a multivariate model to predict prolonged observation admissions.

Limitations due to data quality were a recurrent theme of the presentations, as in for example, the main finding of projects 4 and 5. Assessing the appropriateness of sedation required nursing assessments that were not being collected within the EHR. Project 5 could not resolve discrepancies between a pharmacy utilization database and the Medication Administration Record (MAR) showing when the medications were delivered. Project 1 was also limited by questions of data accuracy and quality and by potential disparities between clinical and billing data. Even project 3, which utilized an existing quality data set, required significant work to clean and complete the data set. Many of these challenges with data arose because we did not have access to raw data from the EHR, but instead used other reports or databases that were intended for alternative purposes. These challenges have served as important lessons to the LHSTP and the health system leaders.

Major Themes

Implementing the LHSTP, as a novel curriculum, presented a steep learning curve for the course leaders. Early successes relied on a supportive environment, health system buy-in, diverse expertise, and enthusiastic learners. Challenges we have encountered include irregular attendance, provision of faculty mentorship, and challenges inherent in immature data systems.

To address these we have made some important changes for the upcoming academic year. We have reorganized the curriculum to front-load the skills needed to begin work on the final project and to provide just-in-time instruction. Selection of trainees’ final topics will occur earlier in the year, allowing more time for a robust product. We plan to use trainees’ selected topics for the minidatabase exercise (rather than a common, assigned topic), which will build familiarity with data analysis and will
identify crucial barriers to trainees’ chosen topics sooner. This should allow refinement of the approach and identification of additional supporting resources. Along these lines, we will make additional statistical support available for groups who do not have skills in using statistical software.

We continue to gain greater operational IT support and to learn about the data structure at our institution. The initial projects have taught both the learners and the course directors about limitations of the readily accessed data at Duke. Subsequent projects have addressed limitations in the data. For example, the chief aim of a current project is to identify the mechanism for linking neonatal–maternal pairs within the health record. We knew of this limitation based on the project presented in year 2, so when a subsequent group with similar interests came through we knew to direct them to this problem early on. Many of our current projects have identified opportunities that allow access to the raw EHR data (Epic Clarity tables), accessed through professional data analysts.

This has required us to be more active in curating viable projects with identified mentors. This year, there have been several large-scale quality improvement efforts at our institution whose clinical champions have asked us for assistance in analyzing the resulting data. This development will allow our current trainees to join a project in the outcome evaluation stage and also work with professional data scientists.

Based on our survey results, we agreed that trainees could benefit from more mentorship, so we had initially intended to reduce the number of trainees back to six. But subsequently two highly motivated applicants joined the program, bringing the total to eight for the third cohort. We have set expectations for in-person meeting attendance and will better coordinate meetings with trainees’ schedules. We will also work more proactively to strengthen the ties between trainees and project mentors, which may involve recognition—financial or otherwise—of these mentors’ effort. We have asked our current mentors to attend sessions when their group is presenting their project charters and interim results to ensure they remain actively involved in the projects and accountable for their progress.

We are also pursuing an official certificate of completion recognized by the Office of Graduate Medical Education, as currently exists at our institution for leadership, education, ethics, and patient safety. We are working to retain skilled and interested graduates of the LHSTP in leadership roles, which we hope will extend to their junior faculty roles.

While our trainees achieved remarkable accomplishments in one year, time constraints meant that the projects could not progress toward implementation. Not every project idea once studied is amenable to an intervention, and our trainees, faculty, and health system administration appreciate that. For such projects, we emphasize what we learned from the study phase of the cycle. While this does not demonstrate the rapid-cycle improvement we hope to see out of a fully functional LHS, it is also an important lesson to understand a problem, the limitations of our current environment, and what it might take to change these, even if change is not presently feasible. On the other hand, we are advancing promising projects to the execution phase by having members of our third cohort pick up a project where the prior cohort left off, and by supporting graduates in continuing their projects following completion of their training. One such project has segued into a systemwide, health-system improvement effort with a focus on improving EHR data quality and accuracy of nursing assessments, which will allow rapid quality reporting and eventually accumulate a body of evidence to
support comparative effectiveness. We also hope the current potential projects, which evaluate existing interventions, will provide a more comprehensive LHS experience.

We are exploring ways to disseminate our curriculum to other institutions. We have hosted a visiting professor, supported by an AAMC grant. We hope that our departing graduates will also take the curriculum to other institutions. Most importantly, as the LHSTP continues to grow, we plan to assess feasibility of further scaling to include more GME trainees and nonphysician health care workers (e.g., nurses and pharmacists), prospectively measure its impact on trainees, and better define the required infrastructure to make such a curriculum successful.

**Conclusion**

In summary, the LHSTP is a novel curriculum that trains physicians to participate in a future LHS. Its success can be attributed to diverse multidisciplinary expertise and content tailored to our trainees’ unique needs, organized around hands-on projects with health-system impact. Most importantly, though, we recognize that we are teaching toward an ideal system that does not yet exist.

As our program has matured we have learned more about the informatics resources and data structures at our institution, including the strengths and limitations of existing data. This has translated to trainee projects centered on improving existing data. It has also prompted us to identify colleagues who can grant us access to the best sources of data. We have become increasingly visible within the institution, and in this process are establishing stronger partnerships with others engaged in quality improvement work and clinical innovations where our trainees can see the impact of their work.

While we have focused on the more data-oriented tasks of the LHS—scanning and surveillance, and evaluation—we recognize there are other important skills to be built around design of interventions, implementation, and refinement. We hope that as we continue to build relationships around the institution and as prior projects mature, subsequent cohorts and graduates will gain these diverse experiences.

Our ongoing evaluation of this program will be based on quality of final projects, feedback from health system leadership, and periodic evaluations from current students and graduates. We hope that this identifies particularly valuable skills going forward or skills we could improve on developing. Realizing this, and in the spirit of continual improvement, we anticipate that the LHSTP will continue to rapidly evolve, improving our learners’ experience and adapting to future conditions.

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