Development of a rehabilitation researcher survey of knowledge and interest in learning health systems research

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Abstract

Introduction: LeaRRn, an NIH-funded rehabilitation resource center, is dedicated to developing learning health systems (LHS) research competencies within the rehabilitation community. To appropriately target resources and training opportunities for rehabilitation researchers, we developed and pilot tested a survey based on AHRQ LHS research core competencies to assess the training needs of rehabilitation researchers interested in LHS research.

Methods: Survey items were developed by the investigative team and iteratively refined with the assistance of an expert panel using two rounds of content validation. Survey items addressed knowledge of, ability to apply, and interest in LHS research competencies. The survey was pre-pilot tested with six rehabilitation professionals, refined again, and then pilot tested. Time to complete the survey was measured. Spearman correlations examined relationships between knowledge and ability.

Results: A 78-item survey was pilot tested. Forty-five individuals completed the pilot survey in full (71% female, 84% white, and 93% non-Hispanic). Due to concerns about response burden (mean 15 minutes to complete) and strong correlation between “knowledge” and “ability” ratings (all rho >0.57), “ability” was dropped, resulting in a 55-item survey assessing “knowledge” and “interest” in LHS research competencies.

Conclusions: We developed a survey of knowledge and interest in LHS research competencies for rehabilitation researchers. The resulting survey may be used to assess training needs and guide LHS research content development by educators, programs directors, and other initiatives within the rehabilitation research community.

Keywords
competency-based learning, learning health systems, rehabilitation, research education
1 | BACKGROUND

The imperative for developing Learning Health Systems (LHS) has been endorsed by many since the publication of the original Institute of Medicine (IOM) reports\(^1\) and the widespread adoption of electronic health records.\(^2\) At the same time, there has been clear recognition of the need to train a new cadre of individuals who can conduct LHS research.\(^3\) According to the Agency for Healthcare Research and Quality (AHRQ), a LHS researcher is an individual “who is embedded within a health system and collaborates with its stakeholders to produce novel insights and evidence that can be rapidly implemented to improve the outcomes of individuals and populations and health system performance.”\(^3\)

Conducting rigorous LHS research requires researchers, embedded within health systems, to acquire new skills and competencies. LHS research draws on theoretical and applied methods from a variety of fields. An AHRQ-funded technical expert panel identified seven key domains and 33 core competencies required for LHS researchers (Table 1).\(^4\) The seven domains include: (a) systems science, (b) research questions, (c) research methods, (d) informatics, (e) ethics of research, (f) improvement and implementation science, and (g) engagement, leadership and research management.\(^4\)

The Learning Health Systems Rehabilitation Research Network (LeaRRn), an NIH-funded rehabilitation resource center is dedicated to developing LHS research competencies in rehabilitation researchers.\(^5\) This network was established with the long-term goal of accelerating the translation of rehabilitation research evidence to practice by creating a cadre of LHS researchers that could conduct embedded research within health systems. Despite increasing evidence on the effectiveness of rehabilitation, our knowledge of the barriers to dissemination, implementation, scalability, and sustainability of effective interventions in real-world care is quite limited. LHS research competencies are needed in rehabilitation to help disseminate and implement best practices across the spectrum of providers and patients.\(^6,7\) Value-based payment models and other payment policy changes for rehabilitation services also require health systems to understand how best practices can be incorporated while de-emphasizing low value or adverse practices.

Rehabilitation care is particularly suited to a LHS framework as rehabilitation care providers (e.g., physical therapists, occupational therapists, speech language pathologists, and rehabilitation psychologists) often see patients over several visits and routinely collect data on impairments and patient-centered outcomes during an episode of care.\(^8\) With the adoption of EHRs in most health systems and efforts to standardize outcome measurement, rehabilitation care providers now have access to vast amounts of data that can be used to transform into a learning health system (LHS).\(^9\) However, they frequently lack the knowledge and expertise to participate in LHS efforts.

Part of LeaRRn’s work in the first year of funding was to survey rehabilitation researchers to identify knowledge gaps and interest in LHS research competencies in order to appropriately target resources and training opportunities. In this paper, we describe our process of developing and pilot testing the survey to assess the needs of rehabilitation researchers interested in LHS research.

2 | METHODS

2.1 | Overview

The survey was developed using the framework of LHS core research competencies.\(^4\) Survey items were written by the investigative team and were iteratively refined with the assistance of a multidisciplinary expert panel (who had not been involved in initial item writing) using two rounds of content validation. The survey was then tested (pre-pilot test) on a small group of rehabilitation professionals, refined, and then pilot tested. A summary of the survey development process is shown in Figure 1. A detailed synopsis showing initial item generation and changes made through the item refinement process is shown in Table 1. The final survey contains 55 items addressing level of knowledge and interest in learning more about LHS research competencies.

2.1.1 | Creation of the expert panel

We identified rehabilitation professional associations through personal contacts and an internet search. We solicited nominations for an “expert panel” from 17 professional associations that represented a wide variety of rehabilitation disciplines. Ten members representing eight rehabilitation professions (Prosthetics and Orthotics, Speech Language, Physical Therapy, Occupational Therapy, Medicine Research, Psychology Research, Rehabilitation Counseling, and Audiology) were included.

2.2 | Specifying unique and mutually exclusive LHS competencies

The investigative team reviewed the wording and content of each of the 33 LHS research core competencies as identified by Forrest et al. The team wrote separate items for those core competencies that included more than one concept. For example, the content of the original core competency, “Demonstrate the ability to employ specific quality improvement methods to reduce avoidable variation in clinical processes and outcomes in routine practice” was divided into two items: A) “Quality improvement methods to reduce avoidable variation in clinical processes,” and B) “Quality improvement methods to reduce avoidable variation in clinical outcomes.” This process resulted in 72 items.

Additionally, the team added seven “red herring” items (one per domain) to help us verify that respondents were paying careful attention to the survey content. (Appendix S1). These items were related to health care delivery or research, but were not considered by investigative team members to be relevant for LHS rehabilitation research.
### Systems Science: To understand how health systems are financed and operate and how to apply systems theory to research and implementation

| Original Core Competency | Action\(^a\) | Round 1 Item | Action\(^a\) | Round 2 Item | Action\(^a\) | Pre-pilot item | Pilot item | Action\(^a\) | Final Item |
|--------------------------|-------------|--------------|-------------|--------------|-------------|---------------|------------|-------------|------------|
| **Demonstrate knowledge...** | Rev         | Systems theory (conceptual frameworks addressing how the parts of a health system interact to produce value for stakeholders) | Rev         | Conceptual frameworks addressing how the parts of a health system interact to produce value for stakeholders | Rev         | Conceptual frameworks addressing how the parts of a health system interact to produce value for stakeholders (eg, Complex Adaptive Systems, Social-Ecological Framework) | Keep       | Conceptual frameworks addressing how the parts of a health system interact to produce value for stakeholders (eg, Complex Adaptive Systems, Social-Ecological Framework) | Keep       | Conceptual frameworks addressing how the parts of a health system interact to produce value for stakeholders (eg, Complex Adaptive Systems, Social-Ecological Framework) |
| **Demonstrate systems...** | Rev         | Designing research for complex health systems | Rev         | Conducting rehabilitation research with health systems | Keep       | Designing and conducting rehabilitation research with health systems | Keep       | Designing and conducting rehabilitation research with health systems | Keep       | Designing and conducting rehabilitation research with health systems |
| **Demonstrate knowledge...** | Rev         | Conducting research in complex health systems | Rev         | Implementing research evidence in health systems | Rev         | Implementing research evidence in health systems | Keep       | Implementing research evidence in health systems | Keep       | Implementing research evidence in health systems |
| **Demonstrate knowledge...** | Keep       | Financing of rehabilitation services | Keep       | Organization of rehabilitation services (facilities, equipment, team composition, and training methodology) | Rev         | Organization of rehabilitation services (facilities, equipment, team composition, and training) | Rev         | Organization of rehabilitation services (facilities, equipment, team composition, and training) | Rev         | Organization of rehabilitation services (facilities, equipment, team composition, and training) |
| **Outcomes of rehabilitation...** | Rev         | Outcomes of rehabilitation services valued by health systems | Keep       | The interrelationships between financing, organization, delivery, and outcomes of rehabilitation services | Keep       | The interrelationships between financing, organization, delivery, and outcomes of rehabilitation services | Keep       | The interrelationships between financing, organization, delivery, and outcomes of rehabilitation services | Keep       | The interrelationships between financing, organization, delivery, and outcomes of rehabilitation services |
| **Demonstrate ability to assess the extent to which research activities will likely contribute to the quality, equity or value of health systems.** | Rev         | Assessing the extent to which research activities will likely contribute to the quality of health systems | Rev         | Assessing the extent to which research activities will likely contribute to the equity of health systems | Rev         | Assessing the extent to which research activities will likely contribute to the quality of health systems | Keep       | Assessing the extent to which research activities will likely contribute to the quality of health systems | Keep       | Assessing the extent to which research activities will improve the quality of health systems |

(Continues)
### TABLE 1 (Continued)

#### A

**Systems Science: To understand how health systems are financed and operate and how to apply systems theory to research and implementation**

| Original Core Competency | Round 1 item | Action* | Round 2 item | Action* | Pre-pilot item | Pilot item | Action* | Final item |
|--------------------------|--------------|---------|--------------|---------|----------------|------------|---------|-----------|
| Assessing the extent to which research activities will likely contribute to the value of health systems | Rev | Assessing the extent to which research activities will improve the value of health systems | Keep | Assessing the extent to which research activities will improve the value of health systems | Keep | Assessing the extent to which research activities will improve the value of health systems | Keep | Assessing the extent to which research activities will improve the value of health systems |

**Research questions: To ask meaningful questions relevant to health system stakeholders and evaluate the usefulness of scientific evidence and insights**

| Core Competency | Round 1 item | Action* | Round 2 item | Action* | Pre-pilot item | Pilot item | Action* | Final item |
|-----------------|--------------|---------|--------------|---------|----------------|------------|---------|-----------|
| Demonstrate the ability to compose feasible and timely research questions and hypotheses, incorporating stakeholder priorities, to generate evidence that informs meaningful clinical and policy decisions. | Composing feasible research questions | Rev | Composing research questions that can realistically be addressed within health systems | Keep | Composing research questions that can realistically be addressed within health systems | Keep | Composing research questions that can realistically be addressed within health systems | Keep |
| Composing feasible research hypotheses | Keep | Composing feasible research hypotheses | Keep | Composing feasible research hypotheses | Keep | Composing feasible research hypotheses | Keep |
| Incorporating stakeholder priorities to inform meaningful clinical decisions | Com | - | NA | - | - | NA | - |
| Incorporating stakeholder priorities to inform meaningful policy decisions | Rev | Composing research questions that address meaningful clinical and policy issues | Keep | Composing research questions that address meaningful clinical and policy issues | Keep | Composing research questions that address meaningful clinical and policy issues | Rev |
| Demonstrate the ability to engage with all relevant stakeholders (patients, families, clinicians, and system leaders) in the elicitation and prioritization of research questions that address current and future stakeholder needs. | Engaging relevant stakeholders (patients, families, clinicians, and system leaders) to identify research questions that address stakeholder needs | Keep | Engaging relevant stakeholders (patients, families, clinicians, and system leaders) to identify research questions that address stakeholder needs | Com | Engaging relevant stakeholders (patients, families, clinicians, and system leaders) to identify research questions that address stakeholder needs | NA | Engaging relevant stakeholders (patients, families, clinicians, and system leaders) to identify research questions that address stakeholder needs |
TABLE 1  (Continued)

Research questions: To ask meaningful questions relevant to health system stakeholders and evaluate the usefulness of scientific evidence and insights

| Core Competency | Round 1 item | Action | Round 2 item | Action | Pre-pilot item | Pilot item | Action | Final item |
|------------------|--------------|--------|--------------|--------|---------------|-----------|--------|-----------|
| Engaging with relevant stakeholders (patients, families, clinicians, and system leaders) to prioritize research questions that address stakeholder needs | Rev | Engaging with stakeholders to identify and prioritize research questions that address their needs | Keep | Engaging with stakeholders to identify and prioritize research questions that address their needs | Keep | Engaging with stakeholders to identify and prioritize research questions that address their needs |
| Assessing scientific evidence to identify novel LHS questions | Rev | Assessing scientific evidence to assess gaps and identify important research questions | Rev | Assessing scientific evidence to address gaps and identify important research questions | Assessing scientific evidence to address gaps and identify important research questions | Keep | Assessing scientific evidence to address gaps and identify important research questions |
| Assessing scientific evidence to judge the applicability to a local care setting | Rev | Assessing scientific evidence to determine its applicability to the care setting | Keep | Assessing scientific evidence to determine its applicability to the care setting | Keep | Assessing scientific evidence to determine its applicability to the care setting |

Research methods: To conduct research within the context of real-world health systems using appropriate study designs and analytic methods to assess outcomes of interest to health systems stakeholders

| Core Competency | Round 1 item | Action | Round 2 item | Action | Pre-pilot item | Pilot item | Action | Final item |
|------------------|--------------|--------|--------------|--------|---------------|-----------|--------|-----------|
| Demonstrate ability to use theory and conceptual models in the design and interpretation of LHS research. | Keep | Using theory and conceptual models for research design | Rev | Using theory and conceptual models for research design | Using conceptual framework for research design and interpretation of results | Using conceptual framework for research design and interpretation of results | Keep | Using a conceptual framework for research design and interpretation of results |
| Using theory and conceptual models for interpreting LHS research results | Rev | Using theory and conceptual models in interpretation of research results | Com | - | - | NA | - |

(Continues)
| Core Competency                                                                 | Round 1 item                                                                 | Action* | Round 2 item                                                                 | Action* | Pre-pilot item                                                                 | Pilot item                                                                 | Action* | Final item                                                                 |
|--------------------------------------------------------------------------------|------------------------------------------------------------------------------|---------|------------------------------------------------------------------------------|---------|------------------------------------------------------------------------------|----------------------------------------------------------------------------|---------|----------------------------------------------------------------------------|
| **Research methods: To conduct research within the context of real-world health systems using appropriate study designs and analytic methods to assess outcomes of interest to health systems stakeholders** | Designing studies for LHS research that are minimally disruptive to health systems and practices | Rev     | Designing studies that are not overly burdensome to health systems and practices | Keep    | Designing studies that are not overly burdensome to health systems and practices | Keep | Designing studies that are not overly burdensome to health systems and practices |
| **Demonstrate ability to develop an appropriate observational, quasi-experimental, or experimental study design while mitigating threats to internal and external validity for research that is minimally disruptive to operations in real-world health systems and practices.** | Using mixed (qualitative and quantitative) research methodology in LHS research | Keep    | Using mixed (qualitative and quantitative) research methodology in LHS research | Keep    | Using mixed (qualitative and quantitative) research methodology in LHS research | Keep | Using mixed (qualitative and quantitative) research methodology in LHS research |
| **Demonstrate knowledge of how to assess multilevel determinants of health and health care disparities when designing studies.** | Assessing the multilevel determinants of health (eg, physical, social, economic, and environmental factors) | Rev     | Assessing the multilevel determinants of health (eg, physical, social, economic, and environmental factors) | Keep    | Assessing the multilevel determinants of health (eg, physical, social, economic, and environmental factors) | Keep | Assessing the multilevel determinants of health (eg, physical, social, economic, and environmental factors) |
| | Assessing health care disparities (ie, differences between groups in access to, use of, and quality of care) | Rev     | Assessing health care disparities (ie, differences between groups in access to, use of, and quality of care) | Keep    | Assessing health care disparities (ie, differences between groups in access to, use of, and quality of care) | Keep | Assessing health care disparities (ie, differences between groups in access to, use of, and quality of care) |
| **Demonstrate ability to select and interpret appropriate clinical, financial, and patient-centered outcomes of interest based on the concepts they measure and their measurement properties.** | Selecting financial outcome measures | Rev     | Selecting outcome measures that are important to health systems (eg, financial, productivity, or quality measures) | Keep    | Selecting outcome measures that are important to health systems (eg, financial, productivity, or quality measures) | Keep | Selecting outcome measures that are important to health systems (eg, financial, productivity, or quality measures) |
TABLE 1 (Continued)

Research methods: To conduct research within the context of real-world health systems using appropriate study designs and analytic methods to assess outcomes of interest to health systems stakeholders

| Core Competency | Round 1 item | Action\(^a\) | Round 2 item | Action\(^a\) | Pre-pilot item | Pilot item | Action\(^a\) | Final item |
|-----------------|--------------|--------------|--------------|--------------|----------------|------------|--------------|-----------|
| Selecting patient centered outcome measures | Rev | Selecting outcome measures that are meaningful to patients | Keep | Selecting outcome measures that are meaningful to patients | Selecting outcome measures that are meaningful to patients | Keep | Selecting outcome measures that are meaningful to patients | |
| Mapping outcomes to measurement concepts | DLP | NA | NA | NA | NA | NA | NA | NA |

Demonstrate ability to apply the principles of hypothesis testing and statistical inference to data collected routinely through the course of care as well as supplemental data from patients, providers and health systems.

| Core competency | Round 1 item | Action\(^a\) | Round 2 item | Action\(^a\) | Pre-pilot item | Pilot item | Action\(^a\) | Final item |
|-----------------|--------------|--------------|--------------|--------------|----------------|------------|--------------|-----------|
| Using data from electronic health records and other clinical information sources for research and quality improvement | Keep | Using data from electronic health records and other clinical information sources for quality improvement | Keep | Using data from electronic health records and other clinical information sources for quality improvement | Using data from electronic health records and other clinical information sources for quality improvement | Keep | Using data from electronic health records and other clinical information sources for quality improvement |
| Using data from electronic health records and other clinical information sources for research | Keep | Using data from electronic health records and other clinical information sources for research | Com | - | - | - | NA | - |

Informatics: To know how to use information systems to conduct LHS research and improve patient and health system outcomes

| Core competency | Round 1 item | Action\(^a\) | Round 2 item | Action\(^a\) | Pre-pilot item | Pilot item | Action\(^a\) | Final item |
|-----------------|--------------|--------------|--------------|--------------|----------------|------------|--------------|-----------|
| Using data from electronic health records and other clinical information sources for research and quality improvement | Keep | Using data from electronic health records and other clinical information sources for quality improvement | Keep | Using data from electronic health records and other clinical information sources for quality improvement | Using data from electronic health records and other clinical information sources for quality improvement | Keep | Using data from electronic health records and other clinical information sources for quality improvement |
| Using data from electronic health records and other clinical information sources for research | Keep | Using data from electronic health records and other clinical information sources for research | Com | - | - | - | NA | - |

(Continues)
| Core competency | Round 1 item | Action* | Round 2 item | Action* | Pre-pilot item | Pilot item | Action* | Final item |
|-----------------|--------------|---------|--------------|---------|----------------|------------|---------|------------|
| **Informatics: To know how to use information systems to conduct LHS research and improve patient and health system outcomes** | | | | | | | | |
| Demonstrate knowledge about additional data sources that can be linked to health system clinical data in order to augment exposure and outcome ascertainment. | Using additional data sources that can be linked to health system clinical data to augment exposure and outcome ascertainment | Rev | Using additional data sources (eg, census data) that can be linked to health system clinical data to improve the accuracy of intervention and outcome data | Rev | Identifying and using additional data sources (eg, registry, Medicare, geographic) that can be linked to health system clinical data to improve the accuracy of intervention and outcome data | Keep | Identifying and using additional data sources (eg, registry, Medicare, geographic) that can be linked to health system clinical data to improve the accuracy of intervention and outcome data | |
| Demonstrate ability to assess data quality and apply data quality assurance processes, including error prevention, data cleaning, data monitoring, documentation and relevant data standards. | Assessing data quality and data quality assurance processes | Rev | Assessing data quality (eg, accuracy, missingness) and processes for data quality assurance (eg, error prevention, data standards) | Rev | Assessing data quality (eg, accuracy, missingness) and processes for ensuring data quality (eg, error prevention, following data standards) | Keep | Assessing data quality (eg, accuracy, missingness) and processes for ensuring data quality (eg, error prevention, following data standards) | |
| Demonstrate knowledge of population health informatics, including disease surveillance, monitoring of community health, assessment of social and behavioral determinants of health and geographic information systems. | Assessing population health informatics, such as disease surveillance, monitoring of community health | Keep | Assessing population health informatics, such as disease surveillance, monitoring of community health | Rev | Using data to assess and monitor the health of specific populations (eg, health system, provider clinics) | Keep | Using data to assess and monitor the health of specific populations (eg, health system, provider clinics) | |
| Assessing social and behavioral determinants of health | Keep | Assessing social and behavioral determinants of health | Keep | Assessing social and behavioral determinants of health | Keep | Assessing social and behavioral determinants of health | |
| Assessing geographic information (eg, zip code, geocodes) | Rev | Assessing geographic information (eg, zip code, geocodes) | Com | - | - | NA | - |
### TABLE 1  (Continued)

**Informatics: To know how to use information systems to conduct LHS research and improve patient and health system outcomes**

| Core competency                                                                 | Round 1 item                                                                 | Action\(^a\) | Round 2 item                                                                 | Action\(^a\) | Pre-pilot item                                                                 | Pilot item                                                                 | Action\(^a\) | Final item                                                                 |
|---------------------------------------------------------------------------------|-------------------------------------------------------------------------------|---------------|-------------------------------------------------------------------------------|---------------|-------------------------------------------------------------------------------|-------------------------------------------------------------------------------|---------------|-------------------------------------------------------------------------------|
| Demonstrate knowledge of clinical information systems, including clinical information systems, clinical documentation, computerized physician order entry, clinical decision support systems, electronic prescribing, medical imaging and clinical/population dashboards. | Using electronic health records                                               | Rev           | Using clinical information systems (eg, EHR, decision support, medical imaging, dashboards) for research | Rev           | Using data from clinical information systems (eg, EHR, decision support, medical imaging, dashboards) for research | Using data from clinical information systems (eg, EHR, decision support, medical imaging, dashboards) for research | Keep          | Using data from clinical information systems (eg, EHR, decision support, medical imaging, dashboards) for research |
|                                                                                 | Using computerized physician order entry (CPOE)                               | Com           | NA                                                                            | NA            | -                                                                            | -                                                                            | NA            | -                                                                            |
|                                                                                 | Using clinical decision support systems                                       | Com           | NA                                                                            | NA            | -                                                                            | -                                                                            | NA            | -                                                                            |
|                                                                                 | Using electronic prescribing                                                  | DLP           | NA                                                                            | NA            | -                                                                            | -                                                                            | NA            | -                                                                            |
|                                                                                 | Using medical imaging information systems                                      | Com           | NA                                                                            | NA            | -                                                                            | -                                                                            | NA            | -                                                                            |
|                                                                                 | Using clinical/population dashboards                                          | Com           | NA                                                                            | NA            | -                                                                            | -                                                                            | NA            | -                                                                            |

### Health system implementation and ethics: To ensure that research and quality improvement performed in health care settings adheres to the highest ethical and regulatory standards

| Core Competency                                                                 | Round 1 item                                                                 | Action\(^a\) | Round 2 item                                                                 | Action\(^a\) | Pre-pilot item                                                                 | Pilot item                                                                 | Action\(^a\) | Final item                                                                 |
|---------------------------------------------------------------------------------|-------------------------------------------------------------------------------|---------------|-------------------------------------------------------------------------------|---------------|-------------------------------------------------------------------------------|-------------------------------------------------------------------------------|---------------|-------------------------------------------------------------------------------|
| Demonstrate ability to apply ethical principles in the engagement of health systems including issues of business ethics and importance of publishing both positive and negative findings in the public domain. | Applying ethical business principles in the engagement of health systems       | Rev           | Demonstrate the ability to apply research ethics to health systems research.  | Keep          | Demonstrate the ability to apply research ethics to health systems research.  | Demonstrate the ability to apply research ethics to health systems research.  | Keep          | Demonstrate the ability to apply research ethics to health systems research.  |
|                                                                                 | Publishing both positive and negative research findings in the public domain  | Keep          | Publishing both positive and negative research findings in the public domain | Keep          | Publishing both positive and negative research findings in the public domain | Publishing both positive and negative research findings in the public domain | Keep          | Publishing both positive and negative research findings in the public domain |

(Continues)
| Core Competency                                                                 | Round 1 item                                                                 | Actiona | Round 2 item                                                                 | Actiona | Pre-pilot item                                                                 | Actiona | Pilot item                                                                 | Actiona | Final item                                                                 |
|--------------------------------------------------------------------------------|--------------------------------------------------------------------------------|---------|--------------------------------------------------------------------------------|---------|--------------------------------------------------------------------------------|---------|--------------------------------------------------------------------------------|---------|---------------------------------------------------------------------------|
| Demonstrate knowledge of what activities constitute research as opposed to quality improvement activities and seek appropriate oversight for each. | Distinguishing between research and quality improvement activities             | Keep    | Distinguishing between research and quality improvement activities             | Keep    | Distinguishing between research and quality improvement activities             | Keep    | Distinguishing between research and quality improvement activities             | Keep    | Distinguishing between research and quality improvement activities             |
|                                                                                | Seeking appropriate ethics oversight for research                              | Keep    | Seeking appropriate ethics oversight for research                              | Keep    | Seeking appropriate ethics oversight for research                              | Keep    | Seeking appropriate ethics oversight for research                              | Keep    | Seeking appropriate ethics oversight for research                              |
|                                                                                | Seeking appropriate ethics oversight for quality improvement                   | Keep    | Seeking appropriate ethics oversight for quality improvement                   | Keep    | Seeking appropriate ethics oversight for quality improvement                   | Keep    | Seeking appropriate ethics oversight for quality improvement                   | Keep    | Seeking appropriate ethics oversight for quality improvement                   |
| Demonstrate knowledge of specific Health Insurance Portability and Accountability Act (HIPAA) requirements associated with varied data sources used in health systems research activities and seek appropriate approvals. | Understanding Health Insurance Portability and Accountability Act (HIPAA) requirements associated with health systems data | Keep    | Understanding Health Insurance Portability and Accountability Act (HIPAA) requirements associated with health systems data | Keep    | Understanding Health Insurance Portability and Accountability Act (HIPAA) requirements associated with health systems data | Keep    | Understanding Health Insurance Portability and Accountability Act (HIPAA) requirements associated with health systems data | Keep    | Understanding Health Insurance Portability and Accountability Act (HIPAA) requirements associated with health systems data |
|                                                                                | Seeking appropriate approvals for use of protected health information under the Health Insurance Portability and Accountability Act (HIPAA) | Keep    | Seeking appropriate approvals for use of protected health information under the Health Insurance Portability and Accountability Act (HIPAA) | Keep    | Seeking appropriate approvals for use of protected health information under the Health Insurance Portability and Accountability Act (HIPAA) | Keep    | Seeking appropriate approvals for use of protected health information under the Health Insurance Portability and Accountability Act (HIPAA) | Keep    | Seeking appropriate approvals for use of protected health information under the Health Insurance Portability and Accountability Act (HIPAA) |
| Demonstrate ability to identify and minimize potential conflict of interests in the design, conduct, and reporting of research conducted in health systems. | Identifying potential conflicts of interest in the conduct and reporting of research conducted in health systems | Keep    | Identifying potential conflicts of interest in the conduct and reporting of research conducted in health systems | Keep    | Identifying potential conflicts of interest in the conduct and reporting of research conducted in health systems | Keep    | Identifying potential conflicts of interest in the conduct and reporting of research conducted in health systems | Keep    | Identifying potential conflicts of interest in the conduct and reporting of research conducted in health systems |
### TABLE 1 (Continued)

#### Health system implementation and ethics: To ensure that research and quality improvement performed in health care settings adheres to the highest ethical and regulatory standards

| Core Competency                                                                 | Round 1 item | Action | Round 2 item | Action | Pre-pilot item | Pilot item | Action | Final item |
|---------------------------------------------------------------------------------|--------------|--------|--------------|--------|----------------|------------|--------|------------|
| Demonstrate knowledge of ethical and legal considerations when engaging in multisystem studies for compliant collaboration and study conduct. | DLP          | -      | NA           | -      | -              | -          | NA     | -          |

#### Improvement and implementation science: To reduce avoidable variation in process and outcome and ensure the systematic uptake of research findings in a health system

| Core Competency                                                                 | Round 1 item | Action | Round 2 item | Action | Pre-pilot item | Pilot item | Action | Final item |
|---------------------------------------------------------------------------------|--------------|--------|--------------|--------|----------------|------------|--------|------------|
| Demonstrate the ability to employ specific quality improvement methods to reduce avoidable variation in clinical processes and outcomes in routine practice. | Quality improvement methods to reduce avoidable variation in clinical processes | Rev    | Using quality improvement methods to reduce avoidable variation in clinical processes | Rev    | Using quality improvement methods to standardize clinical processes | Using quality improvement methods to standardize clinical processes | Keep   | Using quality improvement methods to standardize clinical processes |
| Quality improvement methods to reduce avoidable variation in clinical outcomes    | Rev          | Using quality improvement methods to reduce avoidable variation in clinical outcomes | Keep   | Using quality improvement methods to reduce avoidable variation in clinical outcomes | Using quality improvement methods to reduce avoidable variation in clinical outcomes | Keep   | Using quality improvement methods to reduce avoidable variation in clinical outcomes |
| Demonstrate the ability to employ specific implementation science or quality improvement methods to study and promote systematic uptake of research findings and other effective clinical interventions into routine practice. | Implementation science methods and strategies to study and promote systematic uptake of evidence into routine practice | Rev    | Using implementation science methods and strategies to study and promote systematic uptake of evidence into routine practice | Keep   | Using implementation science methods and strategies to study and promote systematic uptake of evidence into routine practice | Using implementation science methods and strategies to study and promote systematic uptake of evidence into routine practice | Keep   | Using implementation science methods and strategies to study and promote systematic uptake of evidence into routine practice |
| Quality improvement methods to study and promote systematic uptake of evidence into routine practice | Rev          | Using quality improvement methods to study and promote systematic uptake of evidence into routine practice | Keep   | Using quality improvement methods to study and promote systematic uptake of evidence into routine practice | Using quality improvement methods to reduce avoidable variation in clinical outcomes | Keep   | Using quality improvement methods to reduce avoidable variation in clinical outcomes |
| Demonstrate knowledge regarding when to mount larger efforts to scale-up, spread, and sustain successful interventions based on strength of clinical evidence and organizational and provider | Scaling-up and spreading successful interventions | Rev    | Using strategies to spread successful interventions to new settings | Rev    | Using strategies to implement successful interventions in new settings (eg, other facilities, departments) | Using strategies to implement successful interventions in new settings (eg, other facilities, departments) | Keep   | Using strategies to implement successful interventions in new settings (eg, other facilities, departments) |

(Continues)
TABLE 1  (Continued)

**Improvement and implementation science: To reduce avoidable variation in process and outcome and ensure the systematic uptake of research findings in a health system**

| Core Competency                                                                                                                                  | Round 1 item                                                                 | Action<sup>a</sup> | Round 2 item                                                                 | Action<sup>a</sup> | Pre-pilot item                                                                 | Pilot item                                                                 | Action<sup>a</sup> | Final item                                                                 |
|-------------------------------------------------------------------------------------------------------------------------------------------------|------------------------------------------------------------------------------|--------------------|------------------------------------------------------------------------------|--------------------|--------------------------------------------------------------------------------|------------------------------------------------------------------------------|--------------------|---------------------------------------------------------------------------|
| readiness to change and adopt interventions.                                                                                                    | Sustaining successful interventions                                           | Rev                | Using strategies to sustain successful interventions                          | Keep               | Using strategies to sustain successful interventions                          | Using strategies to sustain successful interventions                          | Keep               | Using strategies to sustain successful interventions                      |
| Engaging stakeholders in all aspects of the research process and effectively lead and manage LHS research teams and project.                    | Building research teams with diverse health system stakeholder representation | Keep               | Building research teams with diverse health system stakeholder representation | Keep               | Building research teams with diverse health system stakeholder representation | Building research teams with diverse health system stakeholder representation | Keep               | Building research teams with diverse health system stakeholder representation |
| Identifying the values used by stakeholder groups involved in research in health systems.                                                        | Identifying and considering stakeholder values in research                    | Rev                | Identifying and considering stakeholder values in research                    | Rev                | Identifying and considering stakeholder values in research                    | Identifying and considering stakeholder values in research                    | Keep               | Identifying and considering stakeholder values in research                |
| Identifying the communication mechanisms used by stakeholder groups involved in research in health systems.                                    | Identifying and using appropriate mechanisms for stakeholder communication in research | Rev                | Using appropriate methods to communicate research findings to stakeholders   | Keep               | Using appropriate methods to communicate research findings to stakeholders   | Using appropriate methods to communicate research findings to stakeholders   | Keep               | Using appropriate methods to communicate research findings to stakeholders |
| Demonstrating ability to translate, disseminate, and communicate the value proposition and business case for research to diverse health system stakeholders. | Translating the value proposition and business case for research to diverse health system stakeholders | Rev                | Translating the benefits and business reasons for research to health system stakeholders | Rev                | Translating the benefits of research to different health system stakeholders (eg, leadership, administrative, clinical) | Translating the benefits of research to different health system stakeholders (eg, leadership, administrative, clinical) | Keep               | Translating the benefits of research to different health system stakeholders (eg, leadership, administrative, clinical) |
| Core Competency                                                                 | Round 1 item                                               | Action* | Round 2 item                                               | Action* | Pre-pilot item                                               | Pilot item                                               | Action* | Final item                                               |
|--------------------------------------------------------------------------------|------------------------------------------------------------|---------|------------------------------------------------------------|---------|-------------------------------------------------------------|----------------------------------------------------------|---------|----------------------------------------------------------|
| Demonstrate ability to conduct effective team-based project management, employing skills in leadership, communication, negotiation, consensus building and problem-solving. | Developing effective team-based project management          | Rev     | Using strategies for effective team-based research project management | Keep    | Using strategies for effective team-based research project management | Using strategies for effective team-based research project management | Keep    | Using strategies for effective team-based research project management |
| Demonstrate ability to develop protocols consistent with health systems needs and timelines, employing patient and clinician engagement and using a mix of conventional and alternative funding sources. | Developing protocols consistent with health systems needs and timelines | Keep    | Developing protocols consistent with health systems needs and timelines | Rev     | Developing protocols consistent with health systems operational needs | Developing protocols consistent with health systems operational needs | Keep    | Developing protocols consistent with health systems operational needs |
| Engaging patients in the research process | Engaging patients in the research process | Keep    | Engaging patients in the research process | Keep    | Engaging patients in the research process | Engaging patients in the research process | Keep    | Engaging patients in the research process |
| Using a mix of conventional and alternative funding sources | Using conventional (eg, grants) and alternative funding (eg, health system) sources for research | Rev     | Using conventional (eg, grants) and alternative funding (eg, health system) sources for research | Keep    | Using conventional (eg, grants) and alternative funding (eg, health system) sources for research | Using conventional (eg, grants) and alternative funding (eg, health system) sources for research | Keep    | Using conventional (eg, grants) and alternative funding (eg, health system) sources for research |
| Implementing protocols aligned with health systems operations and integrated into clinical settings, including engaging clinicians in the research process. | Implementing research protocols informed by stakeholders and aligned with health systems operations | Rev     | Implementing research protocols informed by stakeholders and aligned with health systems operations | Keep    | Implementing research protocols informed by stakeholders and aligned with health systems operations | Implementing research protocols informed by stakeholders and aligned with health systems operations | Keep    | Implementing research protocols informed by stakeholders and aligned with health systems operations |
| Implementing protocols integrated into clinical settings | Implementing clinician informed research protocols into practice settings | Keep    | Implementing clinician informed research protocols into practice settings | Keep    | Implementing clinician informed research protocols into practice settings | Implementing clinician informed research protocols into practice settings | Keep    | Implementing clinician informed research protocols into practice settings |
| Engaging clinicians in the research process | Engaging clinicians in the research process | Keep    | Engaging clinicians in the research process | DLP     | - | - | NA | - |
Thus, the survey used for content validation (described below) contained a total of 78 items.

2.3 Content validation—Round 1

Expert panel members were asked to review the 78 survey items and to rank each item on a three-point scale based on its clarity (1 = not at all, 2 = somewhat, 3 = very), relevance (1 = not at all, 2 = somewhat, 3 = very), and priority (1 = low, 2 = medium, 3 = high) in relation to LHS in rehabilitation. They were also asked to add any comments on the items to aid in improving the survey and its contents.

We utilized content validation indices to help determine the final instrument content.10,11 Rankings of expert panel members were tallied and separate content validation index (CVI) scores were generated for item clarity, relevance, and priority. Scores were then dichotomized as shown in Table 2. For clarity, items rated as very clear were assigned a value of 1 and items rated as not at all clear or somewhat clear were assigned a value of 0. For relevance and priority, items rated as somewhat or very relevant or medium or high priority were assigned a value of 1 and ratings of not at all relevant or low priority were assigned a value of 0. These dichotomizations were chosen to ensure that the items that the majority of the expert panel rated as not at all or only somewhat clear were revised and that only items that were rated as not at all relevant or low priority were dropped.

Study co-investigators (J.S., J.F., L.R., K.P.) reviewed the comments and CVI scores to reach consensus on wording and decisions about which items to exclude for the next round. For all domains, items with content validation index (CVI) scores >0.79 were retained without revision. If an item’s relevance and priority scores were >0.79, but the clarity score was <0.79, the item was retained, but revised by consensus of the investigative team. Most items which had a clarity rating >0.79, but relevance and priority ratings <0.79 were dropped. However, some items with relevance or priority <0.79 that were considered by the investigative team to be highly relevant for learning health systems research were retained. In these instances, the items were revised to help clarify relevance for LHS rehabilitation research. In addition to dropping the seven red herring items, 5 items were dropped after Round 1 review and 44 items were revised or combined with other items leaving 61 items for Round 2 content validation.

2.4 Content validation—Round 2

The revised item set was then circulated to the expert panel and the content rating process was repeated. One item was dropped after CVI review of Round 2. 5 items were combined, and 14 were revised resulting in a 55-item survey organized in the seven domains. For some items, we also provided definitions of terminology based on the feedback of the expert panel (Appendix S2).
Definitions were written by the investigative team after consulting the literature and, in some cases, simplifying or abbreviating for conciseness. The survey that was pilot tested addressed three areas for each item: level of knowledge, ability to apply this knowledge, and interest in learning more. The survey also included demographic and occupation questions as well as a screening question to ascertain interest in learning more about LHS research.

2.5 | Pre-pilot testing

The 55-item survey was pre-piloted with six rehabilitation researchers identified by the study investigators. The purpose of pre-piloting was to test the programmed survey and collect data on time to completion. Participants in the pre-pilot test sample were asked to complete the survey via the internet using the survey software system Qualtrics. For each item they were asked to: indicate their level of knowledge (novice, intermediate, expert); their ability to apply this knowledge (novice, intermediate, expert); and their interest in learning more about the survey item, that is, the competency (not at all, somewhat, very). They were also asked to track the amount of time it took to complete the survey and to provide any additional comments.

The average time to complete the survey in the pre-pilot test sample was 15 minutes (range 10-23 minutes). The investigator team revised response categories for the domains of knowledge and application from “novice,” “intermediate” an “expert” to “none,” “some,” and “a lot” based on feedback about the use of the terms novice and expert. The feedback was that more experience often leads to

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**TABLE 2** Method of dichotomizing scores for content validation

| Definition                                                                 | CVI Dichotomization |
|---------------------------------------------------------------------------|---------------------|
| **Clarity**                                                               |                     |
| The ease of understanding the wording of the item (ie, the meaning of the item is clear and is free of overly vague language or unnecessary jargon) | Not at all           |
|                                                                           | Somewhat            |
|                                                                           | Very                |
| **Relevance**                                                             |                     |
| The usefulness and necessity of this item for conducting rehabilitation research within LHS | Not at all           |
|                                                                           | Somewhat            |
|                                                                           | Very                |
| **Priority**                                                              |                     |
| The importance of training addressing this item for advancing rehabilitation research in LHS | Low                 |
|                                                                           | Medium              |
|                                                                           | High                |
acknowledging how little one knows about a topic. Additionally, the team revised the response domain name of “application” to “ability” to improve clarity.

2.6 | Pilot testing

The study was approved by the University of Pittsburgh Institutional Review Board. Pilot testing participants were recruited by members of the expert panel. The refined survey was circulated to 88 colleagues by email. Survey respondents were not identifiable and the expert panelists had no information on whether or not those they had recruited had completed the survey. No incentives were offered for survey completion.
2.6.1 Results of the Pilot test

Fifty-six individuals began the survey, and 45 completed the survey in full. Of those who did not complete the survey, nine participants only completed the screening questions and two participants only responded to questions in the first domain (system science). Characteristics of participants in the pilot study are shown in Table 3. Briefly, respondents were 71% female, 84% white, and 93% non-Hispanic. Professions with the greatest representation included research (33%), physical therapy (29%), physical medicine and rehabilitation (20%), occupational therapy (18%), speech language pathology (13%), and prosthetic and orthotics (11%). No demographic information is available for the 11 participants who did not complete the full survey.

Time to complete the survey was extracted from Qualtrics. Mean time of all participants that completed the survey in full was 26 minutes (SD 33 minutes). Because Qualtrics captures the entire time to complete a survey, it also counts time for those who stop in the middle, close their browser and return again. As a result, we identified and removed five outliers whose range of completion time was 47-192 minutes. Once outliers were removed, mean time was 16 minutes (SD 8 minutes). Item completion rates were calculated and items that were skipped by ≥5% of respondents were evaluated and considered for elimination. Spearman correlations between ratings of Knowledge and Ability were examined for each item to evaluate redundancy and potential to reduce response burden by eliminating one of the rating categories.

Only one item, “Composing research questions that address meaningful clinical and policy issues,” was skipped by more than 5% of pilot respondents. Because of the relevance and importance of the question, the investigator team revised the item, simplifying it to read, “Composing research questions that address meaningful issues to health systems.”

Correlation results are shown in Table 4. The strength of association between ratings of Knowledge and Ability was strong to very strong for all items (all rho >0.57). For 84% (46/55) of the items, the Spearman’s Correlation Coefficient was >0.7. Given the high correlations between Knowledge and Ability ratings and the concerns about survey response burden, the team decided to remove the Ability ratings from the final survey instrument. A copy of the final survey is provided in Appendix S3.

3 DISCUSSION

We developed a survey for rehabilitation researchers to assess their knowledge of LHS research competencies and their interest in learning more about these competencies. The content of this survey was guided by the LHS research domains and core competencies identified by an AHRQ expert panel. To our knowledge this is the first survey to assess rehabilitation researchers’ knowledge of LHS research competencies as well as interest in learning more about these areas. This survey may also be useful for rehabilitation educators and program directors in developing LHS research content and articulating more specific LHS research competencies, ultimately supporting efforts to promote the growth of rehabilitation-focused LHS researchers.

Our survey is distinctly different from prior work that developed an appraisal inventory to help direct LHS scholar’s individual development plans and which utilized the core competency statements verbatim. We revised some language in the original core competencies and wrote separate survey items for those core competencies that contained multiple components. Feedback from a multidisciplinary expert panel in rehabilitation was used to enhance clarity of language, and relevance for the rehabilitation research community. Items that were not deemed relevant for rehabilitation research were dropped from the survey, while the word “rehabilitation” was added to six items. Thus, this survey provides a novel and innovative active strategy for understanding the needs of the rehabilitation research community and provides LeaRn with the necessary information to target training and resources to those needs.

### Table 4 Correlations between knowledge and ability for each survey item

| Item number | Systems Science | Research Questions | Research Methods | Informatics | Ethics | Improvement | Engagement |
|-------------|-----------------|--------------------|-----------------|-------------|-------|-------------|-------------|
| 1           | 0.77            | 0.57               | 0.85            | 0.64        | 0.89  | 0.84        | 0.70        |
| 2           | 0.77            | 0.65               | 0.81            | 0.66        | 0.70  | 0.75        | 0.74        |
| 3           | 0.80            | 0.88               | 0.74            | 0.80        | 0.72  | 0.78        | 0.66        |
| 4           | 0.71            | 0.81               | 0.83            | 0.74        | 0.84  | 0.81        | 0.75        |
| 5           | 0.86            | 0.82               | 0.69            | 0.80        | 0.88  | 0.77        | 0.81        |
| 6           | 0.76            | 0.83               | 0.66            | 0.83        | 0.89  | 0.63        | 0.88        |
| 7           | 0.81            | 0.74               | 0.92            | 0.95        |       |             |             |
| 8           | 0.81            |                   | 0.95            |             |       |             |             |
| 9           | 0.91            |                   |                 |             |       |             |             |
| 10          | 0.93            |                   |                 |             |       |             |             |
| 11          |                 |                   |                 |             |       |             |             |
| 12          |                 |                   |                 |             |       |             |             |
CONFLICT OF INTEREST

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SUPPORTING INFORMATION

Additional supporting information may be found in the online version of the article at the publisher’s website.

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