# THE PENETRATING POINT

# Assessing Preventability in the Quest to Reduce Hospital Readmissions

Julia G. Lavenberg, PhD,RN<sup>1</sup>, Brian Leas, MS, MA<sup>1</sup>, Craig A. Umscheid, MD, MSCE<sup>1,2,3,4,5</sup>, Kendal Williams, MD, MPH<sup>1,2</sup>, David R. Goldmann, MD<sup>1,2</sup>, Sunil Kripalani, MD, MSc<sup>6,7</sup>\*

<sup>1</sup>Center for Evidence-based Practice, University of Pennsylvania Health System, Philadelphia, Pennsylvania; <sup>2</sup>Department of Medicine, University of Pennsylvania; <sup>3</sup>Leonard Davis Institute of Health Economics, University of Pennsylvania, Philadelphia, Pennsylvania; <sup>4</sup>Center for Clinical Epidemiology and Biostatistics, University of Pennsylvania, Philadelphia, Pennsylvania; <sup>6</sup>Institute for Translational Medicine and Therapeutics, University of Pennsylvania, Philadelphia, Pennsylvania; <sup>6</sup>Section of Hospital Medicine, Division of General Internal Medicine and Public Health, Department of Medicine, Vanderbilt University, Nashville, Tennessee; <sup>7</sup>Center for Clinical Quality and Implementation Research, Vanderbilt University, Nashville, Tennessee.

Hospitals devote significant human and capital resources to eliminate hospital readmissions, prompted most recently by the Centers for Medicare and Medicaid Services (CMS) financial penalties for higher-than-expected readmission rates. Implicit in these efforts are assumptions that a significant proportion of readmissions are preventable, and preventable readmissions can be identified. Yet, no consensus exists in the literature regarding methods to determine which readmissions are reasonably preventable. In this arti-

Hospital readmissions cost Medicare \$15 to \$17 billion per year.<sup>1,2</sup> In 2010, the Hospital Readmission Reduction Program (HRRP), created by the Patient Protection and Affordable Care Act, authorized the Centers for Medicare and Medicaid Services (CMS) to penalize hospitals with higher-than-expected readmission rates for certain index conditions.<sup>3</sup> Other payers may follow suit, so hospitals and health systems nationwide are devoting significant resources to reducing readmissions.<sup>4–6</sup>

Implicit in these efforts are the assumptions that a significant proportion of readmissions are preventable, and that preventable readmissions can be identified. Unfortunately, estimates of preventability vary widely.<sup>7,8</sup> In this article, we examine how "preventable readmissions" have been defined, measured, and calculated, and explore the associated implications for readmission reduction efforts.

#### THE MEDICARE READMISSION METRIC

The medical literature reveals substantial heterogeneity in how readmissions are assessed. Time periods range from 14 days to 4 years, and readmissions may

E-mail: sunil.kripalani@vanderbilt.edu

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2014 Society of Hospital Medicine DOI 10.1002/jhm.2226 Published online in Wiley Online Library (Wileyonlinelibrary.com). cle, we examine strengths and limitations of the CMS readmission metric, explore how preventable readmissions have been defined and measured, and discuss implications for readmission reduction efforts. Drawing on our clinical, research and operational experiences, we offer suggestions to address the key challenges in moving forward to measure and reduce preventable readmissions. *Journal of Hospital Medicine* 2014;9:598–603. © 2014 Society of Hospital Medicine

be counted differently depending on whether they are to the same hospital or to any hospital, whether they are for the same (or a related) condition or for any condition, whether a patient is allowed to count only once during the follow-up period, how mortality is treated, and whether observation stays are considered.<sup>9</sup>

Despite a lack of consensus in the literature, the approach adopted by CMS is endorsed by the National Quality Forum (NQF)<sup>10</sup> and has become the de facto standard for calculating readmission rates. CMS derives risk-standardized readmission rates for acute myocardial infarction (AMI), heart failure (HF), and pneumonia (PN), using administrative claims data for each Medicare fee-for-service beneficiary 65 years or older.11-14 CMS counts the first readmission (but not subsequent ones) for any cause within 30 days of the index discharge, including readmissions to other facilities. Certain planned readmissions for revascularization are excluded, as are patients who left against medical advice, transferred to another acute-care hospital, or died during the index admission. Admissions to psychiatric, rehabilitation, cancer specialty, and children's hospitals<sup>12</sup> are also excluded, as well as patients classified as "observation status" for either hospital stay.<sup>15</sup> Only administrative data are used in readmission calculations (ie, there are no chart reviews or interviews with healthcare personnel or patients). Details are published online and updated at least annually.15

# EFFECTS AND LIMITATIONS OF THE HRRP AND THE CMS READMISSION METRIC

Penalizing hospitals for higher-than-expected readmission rates based on the CMS metric has been successful in the sense that hospitals now feel more accountable

<sup>\*</sup>Address for correspondence and reprint requests: Sunil Kripalani, MD, Section of Hospital Medicine, Division of General Internal Medicine and Public Health, Department of Medicine, Center for Clinical Quality and Implementation Research, Vanderbilt University, 1215 21st Avenue South, Suite 6000 Medical Center East, Nashville, TN 37232; Telephone: 615– 936-1010; Fax: 615–936-1269; moil: sunil krinalani@vanderbilt.cdu

Additional Supporting Information may be found in the online version of this article.

for patient outcomes after discharge; they are implementing transitional care programs, improving communication, and building relationships with community programs.<sup>4,5,16</sup> Early data suggest a small decline in readmission rates of Medicare beneficiaries nationally.<sup>17</sup> Previously, such readmission rates were constant.<sup>18</sup>

Nevertheless, significant concerns with the current approach have surfaced.<sup>19-21</sup> First, why choose 30 days? This time horizon was believed to be long enough to identify readmissions attributable to an index admission and short enough to reflect hospitaldelivered care and transitions to the outpatient setting, and it allows for collaboration between hospitals and their communities to reduce readmissions.<sup>3</sup> However, some have argued that this time horizon has little scientific basis,<sup>22</sup> and that hospitals are unfairly held accountable for a timeframe when outcomes may largely be influenced by the quality of outpatient care or the development of new problems.<sup>23,24</sup> Approximately one-third of 30-day readmissions occur within the first 7 days, and more than half (55.7%) occur within the first 14 days<sup>22,25</sup>; such time frames may be more appropriate for hospital accountability.<sup>26</sup>

Second, spurred by the focus of CMS penalties, efforts to reduce readmissions have largely concerned patients admitted for HF, AMI, or PN, although these 3 medical conditions account for only ~10% of Medicare hospitalizations.<sup>18</sup> Programs focused on a narrow patient population may not benefit other patients with high readmission rates, such as those with gastrointestinal or psychiatric problems,<sup>2</sup> or lead to improvements in the underlying processes of care that could benefit patients in additional ways. Indeed, research suggests that low readmission rates may not be related to other measures of hospital quality.<sup>27,28</sup>

Third, public reporting and hospital penalties are based on 3-year historical performance, in part to accumulate a large enough sample size for each diagnosis. Hospitals that seek real-time performance monitoring are limited to tracking surrogate outcomes, such as readmissions back to their own facility.<sup>29,30</sup> Moreover, because of the long performance time frame, hospitals that achieve rapid improvement may endure penalties precisely when they are attempting to sustain their achievements.

Fourth, the CMS approach utilizes a complex riskstandardization methodology, which has only modest ability to predict readmissions and allow hospital comparisons.<sup>9</sup> There is no adjustment for community characteristics, even though practice patterns are significantly associated with readmission rates,<sup>9,31</sup> and more than half of the variation in readmission rates across hospitals can be explained by characteristics of the community such as access to care.<sup>32</sup> Moreover, patient factors, such as race and socioeconomic status, are currently not included in an attempt to hold hospitals to similar standards regardless of their patient population. This is hotly contested, however, and critics note this policy penalizes hospitals for factors outside of their control, such as patients' ability to afford medications.<sup>33</sup> Indeed, the June 2013 Medicare Payment Advisory Committee (MedPAC) report to Congress recommended evaluating hospital performance against facilities with a like percentage of low-income patients as a way to take into account socioeconomic status.<sup>34</sup>

Fifth, observation stays are excluded, so patients who remain in observation status during their index or subsequent hospitalization cannot be counted as a readmission. Prevalence of observation care has increased, raising concerns that inpatient admissions are being shifted to observation status, producing an artificial decline in readmissions.<sup>35</sup> Fortunately, recent population-level data provide some reassuring evidence to the contrary.<sup>36</sup>

Finally, and perhaps most significantly, the current readmission metric does not consider preventability. Recent reviews have demonstrated that estimates of preventability vary widely in individual studies, ranging from 5% to 79%, depending on study methodology and setting.<sup>7,8</sup> Across these studies, on average, only 23% of 30-day readmissions appear to be avoidable.<sup>8</sup> Another way to consider the preventability of hospital readmissions is by noting that the most effective multimodal care-transition interventions reduce readmission rates by only about 30%, and most interventions are much less effective.<sup>26</sup> The likely fact that only 23% to 30% of readmissions are preventable has profound implications for the anticipated results of hospital readmission reduction efforts. Interventions that are 75% effective in reducing preventable readmissions should be expected to produce only an 18% to 22% reduction in overall readmission rates.<sup>37</sup>

## FOCUSING ON PREVENTABLE READMISSIONS

A greater focus on identifying and targeting preventable readmissions would offer a number of advantages over the present approach. First, it is more meaningful to compare hospitals based on their percentage of discharges resulting in a preventable readmission, than on the basis of highly complex risk standardization procedures for selected conditions. Second, a focus on preventable readmissions more clearly identifies and permits hospitals to target opportunities for improvement. Third, if the focus were on preventable readmissions for a large number of conditions, the necessary sample size could be obtained over a shorter period of time. Overall, such a preventable readmissions metric could serve as a more agile and undiluted performance indicator, as opposed to the present 3-year rolling average rate of all-cause readmissions for certain conditions, the majority of which are probably not preventable.

# DEFINING PREVENTABILITY

Defining a preventable readmission is critically important. However, neither a consensus definition nor a validated standard for assessing preventable hospital readmissions exists. Different conceptual frameworks and terms (eg, avoidable, potentially preventable, or urgent readmission) complicate the issue.<sup>38–40</sup>

Although the CMS measure does not address preventability, it is helpful to consider whether other readmission metrics incorporate this concept. The United Health Group's (UHG, formerly Pacificare) All-Cause Readmission Index, University HealthSystem Consortium's 30-Day Readmission Rate (all cause), and 3M Health Information Systems' (3M) Potentially Preventable Readmissions (PPR) are 3 commonly used measures.

Of these, only the 3M PPR metric includes the concept of preventability. 3M created a proprietary matrix of 98,000 readmission-index admission All Patient Refined Diagnosis Related Group pairs based on the review of several physicians and the logical assumption that a readmission for a clinically related diagnosis is potentially preventable.<sup>24,41</sup> Readmission and index admissions are considered clinically related if any of the following occur: (1) medical readmission for continuation or recurrence of an initial, or closely related, condition; (2) medical readmission for acute decompensation of a chronic condition that was not the reason for the index admission but was plausibly related to care during or immediately afterward (eg, readmission for diabetes in a patient whose index admission was AMI); (3) medical readmission for acute complication plausibly related to care during index admission; (4) readmission for surgical procedure for continuation or recurrence of initial problem (eg, readmission for appendectomy following admission for abdominal pain and fever); or (5) readmission for surgical procedure to address complication resulting from care during index admission.<sup>24,41</sup> The readmission time frame is not standardized and may be set by the user. Though conceptually appealing in some ways, CMS and the NQF have expressed concern about this specific approach because of the uncertain reliability of the relatedness of the admission-readmission diagnosis dyads.<sup>3</sup>

In the research literature, only a few studies have examined the 3M PPR or other preventability assessments that rely on the relatedness of diagnostic codes.<sup>8</sup> Using the 3M PPR, a study showed that 78% of readmissions were classified as potentially preventable,<sup>42</sup> which explains why the 3M PPR and all-cause readmission metric may correlate highly.43 Others have demonstrated that ratings of hospital performance on readmission rates vary by a moderate to large amount, depending on whether the 3M PPR, CMS, or UHG methodology is used.<sup>43,44</sup> An algorithm called SQLape<sup>45,46</sup> is used in Switzerland to benchmark hospitals and defines potentially avoidable readmissions as being related to index diagnoses or complications of those conditions. It has recently been tested in the United States in a single-center study,<sup>47</sup> and a multihospital study is underway.

Aside from these algorithms using related diagnosis codes, most ratings of preventability have relied on subjective assessments made primarily through a review of hospital records, and approximately onethird also included data from clinic visits or interviews with the treating medical team or patients/families.<sup>8</sup> Unfortunately, these reports provide insufficient detail on how to apply their preventability criteria to subsequent readmission reviews. Studies did, however, provide categories of preventability into which readmissions could be organized (see Supporting Information, Appendix Table 1, in the online version of this article for details from a subset of studies cited in van Walraven's reviews that illustrate this point).

Assessment of preventability by clinician review can be challenging. In general, such assessments have considered readmissions resulting from factors within the hospital's control to be avoidable (eg, providing appropriate discharge instructions, reconciling medications, arranging timely postdischarge follow-up appointments), whereas readmissions resulting from factors not within the hospital's control are unavoidable (eg, patient socioeconomic status, social support, disease progression). However, readmissions resulting from patient behaviors or social reasons could potentially be classified as avoidable or unavoidable depending on the circumstances. For example, if a patient decides not to take a prescribed antibiotic and is readmitted with worsening infection, this could be classified as an unavoidable readmission from the hospital's perspective. Alternatively, if the physician prescribing the antibiotic was inattentive to the cost of the medication and the patient would have taken a less expensive medication had it been prescribed, this could be classified as an avoidable readmission. Differing interpretations of contextual factors may partially account for the variability in clinical assessments of preventability.

Indeed, despite the lack of consensus around a standard method of defining preventability, hospitals and health systems are moving forward to address the issue and reduce readmissions. A recent survey by America's Essential Hospitals (previously the National Association of Public Hospitals and Health Systems), indicated that: (1) reducing readmissions was a high priority for the majority (86%) of members, (2) most had established interdisciplinary teams to address the issue, and (3) over half had a formal process for determining which readmissions were potentially preventable. Of the survey respondents, just over one-third rely on staff review of individual patient charts or patient and family interviews, and slightly less than one-third rely on other mechanisms such as external consultants, criteria developed by other entities, or the Institute for Clinical Systems Improvement methodology.<sup>48</sup> Approximately one-fifth make use of 3M's PPR product, and slightly fewer use the list of the Agency for Healthcare Research and Quality's ambulatory

care sensitive conditions (ACSCs). These are medical conditions for which it is believed that good outpatient care could prevent the need for hospitalization (eg, asthma, congestive heart failure, diabetes) or for which early intervention minimizes complications.<sup>49</sup> Hospitalization rates for ACSCs may represent a good measure of excess hospitalization, with a focus on the quality of outpatient care.

### RECOMMENDATIONS

We recommend that reporting of hospital readmission rates be based on preventable or potentially preventable readmissions. Although we acknowledge the challenges in doing so, the advantages are notable. At minimum, a preventable readmission rate would more accurately reflect the true gap in care and therefore hospitals' real opportunity for improvement, without being obscured by readmissions that are not preventable.

Because readmission rates are used for public reporting and financial penalties for hospitals, we favor a measure of preventability that reflects the readmissions that the hospital or hospital system has the ability to prevent. This would not penalize hospitals for factors that are under the control of others, namely patients and caregivers, community supports, or society at large. We further recommend that this measure apply to a broader composite of unplanned care, inclusive of both inpatient and observation stays, which have little distinction in patients' eyes, and both represent potentially unnecessary utilization of acute-care resources.<sup>50</sup> Such a measure would require development, validation, and appropriate vetting before it is implemented.

The first step is for researchers and policy makers to agree on how a measure of preventable or potentially preventable readmissions could be defined. A common element of preventability assessment is to identify the degree to which the reasons for readmission are related to the diagnoses of the index hospitalization. To be reliable and scalable, this measure will need to be based on algorithms that relate the index and readmission diagnoses, most likely using claims data. Choosing common medical and surgical conditions and developing a consensus-based list of related readmission diagnoses is an important first step. It would also be important to include some less common conditions, because they may reflect very different aspects of hospital care.

An approach based on a list of related diagnoses would represent potentially preventable rehospitalizations. Generally, clinical review is required to determine actual preventability, taking into account patient factors such as a high level of illness or functional impairment that leads to clinical decompensation in spite of excellent management.<sup>51,52</sup> Clinical review, like a root cause analysis, also provides greater insight into hospital processes that may warrant improvement. Therefore, even if an administrative measure of potentially preventable readmissions is implemented, hospitals may wish to continue performing detailed clinical review of some readmissions for quality improvement purposes. When clinical review becomes more standardized,<sup>53</sup> a combined approach that uses administrative data plus clinical verification and arbitration may be feasible, as with hospital-acquired infections.

Similar work to develop related sets of admission and readmission diagnoses has already been undertaken in development of the 3M PPR and SQLape measures.<sup>41,46</sup> However, the 3M PPR is a proprietary system that has low specificity and a high false-positive rate for identifying preventable readmissions when compared to clinical review.<sup>42</sup> Moreover, neither measure has yet achieved the consensus required for widespread adoption in the United States. What is needed is a nonproprietary listing of related admission and readmission diagnoses, developed with the engagement of relevant stakeholders, that goes through a period of public comment and vetting by a body such as the NQF.

Until a validated measure of potentially preventable readmission can be developed, how could the current approach evolve toward preventability? The most feasible, rapidly implementable change would be to alter the readmission time horizon from 30 days to 7 or 15 days. A 30-day period holds hospitals accountable for complications of outpatient care or new problems that may develop weeks after discharge. Even though this may foster shared accountability and collaboration among hospitals and outpatient or community settings, research has demonstrated that early readmissions (eg, within 7-15 days of discharge) are more likely preventable.<sup>54</sup> Second, consideration of the socioeconomic status of hospital patients, as recommended by MedPAC,<sup>34</sup> would improve on the current model by comparing hospitals to like facilities when determining penalties for excess readmission rates. Finally, adjustment for community factors, such as practice patterns and access to care, would enable readmission metrics to better reflect factors under the hospital's control.<sup>32</sup>

## CONCLUSION

Holding hospitals accountable for the quality of acute and transitional care is an important policy initiative that has accelerated many improvements in discharge planning and care coordination. Optimally, the policies, public reporting, and penalties should target preventable readmissions, which may represent as little as one-quarter of all readmissions. By summarizing some of the issues in defining preventability, we hope to foster continued refinement of quality metrics used in this arena.

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#### References

- 1. Sommers A, Cunningham PJ. *Physician Visits After Hospital Discharge: Implications for Reducing Readmissions*. Washington, DC: National Institute for Health Care Reform; 2011. Report no. 6.
- Jencks SF, Williams MV, Coleman EA. Rehospitalizations among patients in the Medicare fee-for-service program. N Engl J Med. 2009; 360(14):1418–1428.
- 3. Centers for Medicare and Medicaid Services, US Department of Health and Human Services. Medicare program: hospital inpatient prospective payment systems for acute care hospitals and the longterm care hospital prospective payment system and FY 2012 rates. *Fed Regist*. 2011;76(160):51476–51846.
- Bradley EH, Sipsma H, Curry L, Mehrotra D, Horwitz LI, Krumholz H. Quality collaboratives and campaigns to reduce readmissions: what strategies are hospitals using? *J Hosp Med*. 2013;8:601–608.
   Bradley EH, Sipsma H, Horwitz LI, Curry L, Krumholz HM. Contem-
- Bradley EH, Sipsma H, Horwitz LI, Curry L, Krumholz HM. Contemporary data about hospital strategies to reduce unplanned readmissions: what has changed [research letter]? *JAMA Intern Med.* 2014; 174(1):154–156.
- Hansen LO, Young RS, Hinami K, Leung A, Williams MV. Interventions to reduce 30-day rehospitalization: a systematic review. Ann Intern Med. 2011;155(8):520–528.
- van Walraven C, Wong J, Hawken S, Forster AJ. Comparing methods to calculate hospital-specific rates of early death or urgent readmission. CMAJ. 2012;184(15):E810–E817.
- van Walraven C, Bennett C, Jennings A, Austin PC, Forster AJ. Proportion of hospital readmissions deemed avoidable: a systematic review. CMAJ. 2011;183(7):E391–E402.
- 9. Kansagara D, Englander H, Salanitro A, et al. Risk prediction models for hospital readmission: a systematic review. *JAMA*. 2011;306(15): 1688–1698.
- National Quality Forum. Patient outcomes: all-cause readmissions expedited review 2011. Available at: http://www.qualityforum.org/ WorkArea/linkit.aspx?LinkIdentifier=id&ItemID=71674. Published July 2012. Accessed April 3, 2013.
- Centers for Medicare & Medicaid Services and The Joint Commission. Specifications manual for national hospital inpatient quality measures, version 4. Available at: http://www.jointcommission.org/specifications\_manual\_for\_national\_hospital\_inpatient\_quality\_measures.aspx. Published July 2012. Accessed April 3, 2013.
  Yale New Haven Health Services Corporation, Center for Outcomes
- 12. Yale New Haven Health Services Corporation, Center for Outcomes Research & Evaluation. 2012 measures maintenance technical report: acute myocardial infarction, heart failure, and pneumonia 30-day risk-standardized readmission measure. Available at: http://www. qualitynet.org/dcs/ContentServer?cid=1219069855841&pagename= QnetPublic%2FPage%2FQnetTier4&c=Page. Published April 16, 2012. Accessed February 11, 2014.
- 13. Yale New Haven Health Services Corporation, Center for Outcomes Research & Evaluation. 2011 measures maintenance technical report: acute myocardial infarction, heart failure, and pneumonia 30-day risk-standardized readmission measures. Available at: http://www. qualitynet.org/dcs/ContentServer?cid=1219069855841& pagename=QnetPublic%2FPage%2FQnetTier4&c=Page. Published April 13, 2011. Accessed February 11, 2014.
- 2011. Accessed February 11, 2014.
  The Joint Commission and Centers for Medicare & Medicaid Services. Specifications manual for national hospital inpatient quality measures, version 3.3 (sections10f-h). Available at: http://www.jointcommission.org/specifications\_manual\_for\_national\_hospital\_inpatient\_quality\_measures/. Accessed October 20, 2011.
- Centers for Medicare & Medicaid Services. Frequently asked questions: CMS publicly reported risk-standardized outcome measures. AMI, HF, and pneumonia mortality and readmission, hospital-wide all-cause unplanned readmission, THA/TKA readmission and complication. Available at: http://www.qualitynet.org/dcs/ContentServer? cid=1219069855841&pagename=QnetPublic%2FPage%2FQnet Tier4&c=Page. Updated September 20, 2013. Accessed February 11, 2014.

- Bradley EH, Curry L, Horwitz LI, et al. Contemporary evidence about hospital strategies for reducing 30-day readmissions: a national study. *J Am Coll Cardiol.* 2012;60(7):607–614.
- 17. Gerhardt G, Yemane A, Hickman P, Oelschlaeger A, Rollins E, Brennan N. Data shows reduction in Medicare hospital readmission rates during 2012. *Medicare Medicaid Res Rev.* 2013;3(2):E1–E11.
- Joynt KE, Jha AK. Thirty-day readmissions—truth and consequences. N Engl J Med. 2012;366(15):1366–1369.
- Burke RE, Kripalani S, Vasilevskis EE, Schnipper JL. Moving beyond readmission penalties: creating an ideal process to improve transitional care. J Hosp Med. 2013;8(2):102–109.
- Joynt KE, Jha AK. A path forward on Medicare readmissions. N Engl J Med. 2013;368(13):1175–1177.
- 21. American Hospital Association. TrendWatch: examining the drivers of readmissions and reducing unnecessary readmissions for better patient care. Washington, DC: American Hospital Association; 2011.
- Dharmarajan K, Hsieh AF, Lin Z, et al. Diagnoses and timing of 30day readmissions after hospitalization for heart failure, acute myocardial infarction, or pneumonia. *JAMA*. 2013;309(4):355–363.
- Joynt KE, Jha AK. Characteristics of hospitals receiving penalties under the hospital readmissions reduction program. JAMA. 2013; 309(4):342–343.
- 24. Goldfield NI, McCullough EC, Hughes JS, Tang AM, Eastman B, Rawlins LK, et al. Identifying potentially preventable readmissions. *Health Care Financ Rev.* 2008;30(1):75–91.
- Vashi AA, Fox JP, Carr BG, et al. Use of hospital-based acute care among patients recently discharged from the hospital. JAMA. 2013; 309(4):364–371.
- Kripalani S, Theobald CN, Anctil B, Vasilevskis EE. Reducing hospital readmission rates: current strategies and future directions. *Annu Rev Med.* 2014;65:471–485.
- Krumholz HM, Lin Z, Keenan PS, et al. Relationship between hospital readmission and mortality rates for patients hospitalized with acute myocardial infarction, heart failure, or pneumonia. *JAMA*. 2013; 309(6):587–593.
- Stefan MS, Pekow PS, Nsa W, et al. Hospital performance measures and 30-day readmission rates. J Gen Intern Med. 2013;28(3):377–385.
- Davies SM, Saynina O, McDonald KM, Baker LC. Limitations of using same-hospital readmission metrics. *Int J Qual Health Care*. 2013;25(6):633–639.
- Nasir K, Lin Z, Bueno H, et al. Is same-hospital readmission rate a good surrogate for all-hospital readmission rate? *Med Care*. 2010; 48(5):477-481.
- Epstein AM, Jha AK, Orav EJ. The relationship between hospital admission rates and rehospitalizations. N Engl J Med. 2011;365(24): 2287–2295.
- Herrin J, St. Andre J, Kenward K, Joshi MS, Audet AJ, Hines SC. Community factors and hospital readmission rates [published online April 9, 2014]. *Health Serv Res.* doi: 10.1111/1475– 6773.12177.
- American Hospital Association. Hospital readmissions reduction program: factsheet. American Hospital Association. Available at: http:// www.aha.org/content/13/fs-readmissions.pdf. Published April 14, 2014. Accessed May 5, 2014.
- 34. Medicare Payment Advisory Commission. Report to the congress: Medicare and the health care delivery system. Available at: http:// www.medpac.gov/documents/Jun13\_EntireReport.pdf. Published June 14, 2013. Accessed May 5, 2014.
- Feng Z, Wright B, Mor V. Sharp rise in Medicare enrollees being held in hospitals for observation raises concerns about causes and consequences. *Health Aff (Millwood)*. 2012;31(6):1251–1259.
- Daughtridge GW, Archibald T, Conway PH. Quality improvement of care transitions and the trend of composite hospital care. JAMA. 2014;311(10):1013–1014.
- van Walraven C, Forster AJ. When projecting required effectiveness of interventions for hospital readmission reduction, the percentage that is potentially avoidable must be considered. *J Clin Epidemiol.* 2013; 66(6):688–690.
- van Walraven C, Austin PC, Forster AJ. Urgent readmission rates can be used to infer differences in avoidable readmission rates between hospitals. J Clin Epidemiol. 2012;65(10):1124–1130.
- van Walraven C, Bennett C, Jennings A, Austin PC, Forster AJ. Proportion of hospital readmissions deemed avoidable: a systematic review. CMAJ. 2011;183(7):E391–E402.
- Yam CH, Wong EL, Chan FW, Wong FY, Leung MC, Yeoh EK. Measuring and preventing potentially avoidable hospital readmissions: a review of the literature. *Hong Kong Med J.* 2010;16(5): 383–389.
- 41. 3M Health Information Systems. Potentially preventable readmissions classification system methodology: overview. 3M Health Information Systems; May 2008. Report No.: GRP-139. Available at: http://multimedia.3m.com/mws/mediawebserver?666666UuZjcFSLXTtNXMtmxMEEVuQEcuZgVs6EVs6E6666666--. Accessed June 8, 2014.

- 42. Jackson AH, Fireman E, Feigenbaum P, Neuwirth E, Kipnis P, Bellows J. Manual and automated methods for identifying potentially preventable readmissions: a comparison in a large healthcare system. *BMC Med Inform Decis Mak*. 2014;14:28.
- 43. Mull HJ, Chen Q, O'Brien WJ, Shwartz M, Borzecki AM, Hanchate A, et al. Comparing 2 methods of assessing 30-day readmissions: what is the impact on hospital profiling in the Veterans Health Administration? *Med Care*. 2013;51(7):589–596.
- 44. Boutwell A, Jencks S. It's not six of one, half-dozen the other: a comparative analysis of 3 rehospitalization measurement systems for Massachusetts. Academy Health Annual Research Meeting. Seattle, WA. 2011. Available at: http://www.academyhealth.org/files/2011/tuesday/ boutwell.pdf. Accessed May 9, 2014.
- 45. Halfon P, Eggli Y, Pretre-Rohrbach I, Meylan D, marazzi A, Burnand B. Validation of the potentially avoidable hospital readmission rate as a routine indicator of the quality of hospital care. *Med Care*. 2006; 44(11):972–981.
- Halfon P, Eggli Y, van Melle G, Chevalier J, Wasserfallen J, Burnand B. Measuring potentially avoidable hospital readmissions. J Clin Epidemiol. 2002;55:573–587.

- Donze J, Aujesky D, Williams D, Schnipper JL. Potentially avoidable 30-day hospital readmissions in medical patients: derivation and validation of a prediction model. *IAMA Intern Med.* 2013;173(8):632–638.
- tion of a prediction model. *JAMA Intern Med.* 2013;173(8):632–638.
  National Association of Public Hospitals and Health Systems. NAPH members focus on reducing readmissions. Available at: www.naph. org. Published June 2011. Accessed October 19, 2011.
- Agency for Healthcare Research and Quality. AHRQ quality indicators: prevention quality indicators. Available at: http://www.qualityindicators. ahrq.gov/Modules/pqi\_resources.aspx. Accessed February 11, 2014.
   Baier RR, Gardner RL, Coleman EA, Jencks SF, Mor V, Gravenstein
- Baier RR, Gardner RL, Coleman EA, Jencks SF, Mor V, Gravenstein S. Shifting the dialogue from hospital readmissions to unplanned care. *Am J Manag Care*. 2013;19(6):450–453.
- 51. Krumholz HM. Post-hospital syndrome—an acquired, transient condition of generalized risk. N Engl J Med. 2013;368(2):100–102.
- Reuben DB, Tinetti ME. The hospital-dependent patient. N Engl J Med. 2014;370(8):694-697.
- Auerbach AD, Patel MS, Metlay JP, et al. The hospital medicine reengineering network (HOMERuN): a learning organization focused on improving hospital care. *Acad Med.* 2014;89(3):415–420.
- 54. van Walraven C, Jennings A, Taljaard M, et al. Incidence of potentially avoidable urgent readmissions and their relation to all-cause urgent readmissions. CMAJ. 2011;183(14):E1067–E1072.