Antimicrobial stewardship and antibiograms: importance of moving beyond traditional antibiograms

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Abstract: The rapid evolution of resistance, particularly among Gram-negative bacteria, requires appropriate identification of patients at risk followed by administration of appropriate empiric antibiotic therapy. A primary tenet of antimicrobial stewardship programs (ASPs) is the establishment of empiric antibiotic recommendations for commonly encountered infections. An important tool in providing empiric antibiotic therapy recommendations is the use of an antibiogram. While the majority of institutions use a traditional antibiogram, ASPs have an opportunity to enhance antibiogram data. The authors provide the rationale for why ASPs should implement alternative antibiograms, and the importance of incorporating an antibiogram into clinical decision support systems with the goal of providing effective empiric antibiotic therapy.

Keywords: Antimicrobial stewardship, antibiogram, antimicrobial stewardship program

Introduction

Antimicrobial resistance (AMR) is a global threat to society, with deaths attributed to resistant infections projected to exceed 10 million per year by 2050. Among the most commonly resistant pathogens are Gram-negative bacteria, including Pseudomonas aeruginosa, Acinetobacter baumannii, Extended-spectrum beta-lactamase (ESBL) and carbapenemase-producing organisms. Alarming trends in Gram-negative resistance are observed in many hospitals in the United States, where, for example, 15–20% of all P. aeruginosa isolates are categorized as multidrug resistant (MDR) because of non-susceptibility to at least one antibiotic in three or more antibiotic classes. The rapid evolution of resistance among Gram-negative bacteria requires identification of patients at risk for infections by these pathogens followed by administration of appropriate empiric antibiotic therapy. Appropriate initial antibiotic therapy has demonstrated improved clinical outcomes, including a reduction in mortality. A strategy widely endorsed to promote appropriate empiric antibiotic therapy is the implementation of antimicrobial stewardship programs (ASPs). The Infectious Diseases Society of America, Society for Healthcare Epidemiology of America (SHEA) and Pediatric Infectious Diseases Society (PIDS) released a policy statement on antimicrobial stewardship, noting the following: ‘The major objectives of antimicrobial stewardship are to achieve optimal clinical outcomes related to antimicrobial use, thereby limiting the selective pressure on bacterial populations that drives the emergence of antimicrobial-resistance strains.’ A primary tenet of ASPs is the establishment of empiric antibiotic recommendations for commonly encountered infections. An important tool in providing empiric antibiotic...
recommendations is the use of an antibiogram. An antibiogram represents a convenient and widely available measurement of an institution’s pathogens and susceptibilities. While the antibiogram provides a reflection of local resistance patterns, there are several limitations, including: (a) lack of syndromic-specific recommendations; (b) typically no information on organism distribution for a specific infection; (c) lack of utility for infections caused by two or more pathogens; (d) constructed using historical data potentially not reflecting current susceptibility data.

To ensure patients receive appropriate empiric antibiotic therapy based on a suspected site of infection, hospital location, and patient characteristics, there is a need for ASPs to go beyond the traditional antibiogram. ASPs are well suited to collaborate with clinical microbiologists in creating more sophisticated antibiograms to optimize empiric antibiotic therapy. Therefore, in this article we provide the rationale for why ASPs should implement alternative antibiograms, including combination and syndromic, and the importance of incorporating an antibiogram into clinical decision support systems with the goal of providing effective empiric antibiotic therapy.

**Traditional antibiograms**
The most convenient and widely available antibiogram is a traditional antibiogram. A traditional antibiogram is a periodic profile of the proportion of pathogens that are susceptible to an institution’s formulary antibiotics over a given time frame, typically 1 year. The antibiogram has multiple uses, including providing guidance for empiric antibiotic therapy, monitoring changes in resistance over time, and assisting in formulary decisions. The traditional antibiogram is used by a variety of healthcare personnel, including ASPs, infection preventionists, epidemiologists, microbiologists, pharmacists, and prescribers.

In the United States, the Clinical and Laboratory Standards Institute (CLSI) provides recommendations for antibiogram development and reporting. CLSI provides several key recommendations in antibiogram development, including: (a) inclusion of isolates collected from patients for diagnostic purposes; (b) inclusion of the first isolate of a given organism per patient per analysis period; (c) inclusion of at least 30 isolates of a specific pathogen during the analysis period; (d) antibiogram analysis at least annually to ensure availability of current data. Importantly, there are a few notable considerations based on CLSI recommendations, primarily antibiograms constructed using first isolate per patient per year will likely underestimate the rate of resistance as resistant pathogen isolates from patients with previously positive culture with a susceptible phenotype are not included in the antibiogram. Importantly, ASPs should be aware of the several advantages and disadvantages associated with traditional antibiograms (Table 1).

**Combination antibiograms**
For certain types of infections such as hospital-acquired and ventilator-associated pneumonia, guidelines recommend the empiric use of two antibiotics to minimize the potential of inappropriate therapy. Frequently, empiric combination antibiotic therapy is based on knowledge from a traditional antibiogram; additional information to assist in the selection of an appropriate regimen is lacking. A combination antibiogram shows the likelihood that at least one drug in a regimen compromising multiple antibiotics will cover a given pathogen and provides a useful clinical tool for evaluating antimicrobial coverage. The data are particularly useful when there are significant susceptibility differences in pathogens to individual antibiotics. When interpreting a combination antibiogram, the antibiotic percentage susceptibility should clearly indicate an increase in empiric coverage with the combination compared to the individual agents alone.

Several studies have demonstrated the utility of a combination antibiogram in evaluating the extent of coverage of multiple antibiotics and in empiric combination therapy recommendations. Puzniak et al. evaluated single-agent susceptibility rates for 11,701 non-duplicate P. aeruginosa isolates. Susceptibility ranged from 72.7% for fluoroquinolones to 85% for piperacillin/tazobactam (TZP). Adding an aminoglycoside resulted in higher susceptibility rates than adding a fluoroquinolone; TZP plus an aminoglycoside resulted in the highest susceptibility rate (93.3%). A second single-center study showed the addition of a second antibiotic (aminoglycoside or fluoroquinolone) to ceftazidime or imipenem significantly increased the likelihood of providing appropriate empiric therapy compared to a single agent. In the study, susceptibility to the Gram-negative
pathogen was 71.5% and 84% to ceftazidime and imipenem, respectively. Susceptibility increased to 82.9% with ceftazidime plus ciprofloxacin and 95% for imipenem plus amikacin.

There are notable limitations with the use of a combination antibiogram. While a combination antibiogram is useful when the pathogen is known, but susceptibilities are not yet available, it does not give the likelihood that the combination of antibiotics will cover all identified organisms. Second, there is a lack of guidance on the use of combination antibiograms for empiric therapy recommendations in high-risk patients. Finally,
susceptibilities of the combination therapy are not derived from in vitro synergy evaluation, but solely, on percentage susceptibility.

**Syndromic antibiograms**

A syndromic antibiogram provides an increased likelihood of appropriate empiric antibiotic therapy for a specific infectious syndrome, considering the weighted incidence of pathogens causing the syndrome. A syndromic antibiogram may be further refined by stratifying susceptibilities based on patient location. This type of antibiogram provides an additional opportunity to enhance data and increase the likelihood of effective empiric antibiotic therapy.

Klinker et al.\(^{16}\) compared antibiotic susceptibilities using a traditional versus syndromic antibiogram for common Gram-negative pathogens associated with pneumonia stratified by patient location. The traditional antibiogram included susceptibility for the three most common Gram-negative pathogens (Escherichia coli, Klebsiella spp., and Pseudomonas aeruginosa) from all sources. The syndromic antibiogram included susceptibility for the same three Gram-negative pathogens isolated from a respiratory source. A targeted empiric antibiotic susceptibility of \(\geq 90\%\) was selected. A total of 17,561 Gram-negative isolates, including 6654 lower respiratory isolates, were collected from lower respiratory specimens collected from ICU patients.\(^{20}\) A total of 871 P. aeruginosa isolates were collected from lower respiratory tract specimens collected from ICU patients across 20 US institutions. Institutions were stratified into one of three categories based on CRPA frequency among ICU patients.\(^{20}\) A total of 871 P. aeruginosa isolates were collected from lower respiratory tract specimens collected from ICU patients across 20 US institutions. Institutions were stratified into one of three categories based on CRPA frequency: CRPA rates \(\leq 20\%\) (CR group 1); 21–40\% (CR group 2); and \(\geq 41\%\) (CR group 3). Beta-lactam susceptibility was evaluated relative to CRPA frequency. Resistance to TZP, FEP, and MEM was reported as 32.4\%, 25.7\%, and 28.4\% (Table 3). In MEM-non-susceptible isolates, resistance to TZP and FEP increased to 64.8\% and 55.7\% of isolates reported as non-susceptible, respectively. Antibiotic susceptibility based on CR group is presented in Table 3. The authors concluded that co-resistance among first-line beta-lactams is frequently observed, limiting empiric choices for the management of hospital-acquired and ventilator-associated pneumonia.

### Table 2. Traditional antibiogram evaluating susceptibility for Escherichia coli, Klebsiella spp., and Pseudomonas aeruginosa collected from all sources.

| Pathogen (n) | FEP | TZP | MEM | C/T | I/R |
|--------------|-----|-----|-----|-----|-----|
| E. coli (6095) | 87  | 95  | 99  | 98  | 99  |
| Klebsiella spp. (4097) | 91  | 89  | 98  | 95  | 99  |
| P. aeruginosa (3649) | 78  | 78  | 77  | 95  | 93  |

C/T, ceftolozane/tazobactam; FEP, cefepime; I/R, imipenem/relebactam; MEM, meropenem; TZP, piperacillin/tazobactam.
bacterial pneumonia. Furthermore, in hospital settings where CRPA frequency is ≥20%, susceptibility testing of newer antipseudomonal agents or consideration for antibiotic modification is warranted.

### Antibiotics and clinical decision support systems

Clinical decision support systems (CDSSs) improve the delivery of healthcare by integrating patient information, providing targeted clinical knowledge, and establishing clinical management tools.21 By merging patient and institutional-specific information, healthcare providers can deliver personalized patient treatment and management. However, it is critical that clinicians have access to and appropriate interpretation of data at the point of prescribing. Typically, antibiograms are available to clinicians through a hospital or ASP website, pocket card, or book. This may result in clinicians not consulting the antibiogram and subsequently prescribing ineffective empiric antibiotic therapy. Therefore, integration of antibiogram data within a CDSS provides an important opportunity to ensuring the administration of appropriate empiric antibiotic therapy.

CDSS tools have been developed and implemented to improve empiric antibiotic administration through a variety of mechanisms. CDSSs typically include a patient’s health problem list populated on and throughout a hospital admission. Treatment guidelines for common infectious

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Table 3. *Pseudomonas aeruginosa* susceptibility among ICU lower respiratory tract isolates stratified by frequency of carbapenem resistance.

| Antibiotic                  | CR group 1 (N=37) (n=264, %) | CR group 2 (N=25) (n=363, %) | CR group 3 (N=18) (n=244, %) |
|-----------------------------|------------------------------|------------------------------|------------------------------|
| Cefepime                    | 83.7                         | 74.9                         | 63.1                         |
| Piperacillin/tazobactam     | 79.6                         | 68.9                         | 52.9                         |
| Meropenem                   | 91.3                         | 73.6                         | 47.5                         |
| Levofloxacin                | 68.6                         | 66.1                         | 48                           |
| Ceftolozane/tazobactam      | 96.6                         | 94.2                         | 90.6                         |
| Imipenem/relebactam         | 98.1                         | 91.7                         | 81.6                         |

CR group 1 = CR *P. aeruginosa* rates ≤20%; CR group 2 = 21–40%; CR group 3 = ≥41%.

CR, carbapenem resistant; ICU, intensive care unit; N, number of institutions; n, number of isolates.
diseases syndromes are created and updated by the ASP with endorsement from multidisciplinary healthcare professionals and incorporated into the CDSS. Clinicians are alerted to prescribe medications based on the treatment guideline which is prompted from the health problem list. For common infectious syndromes, treatment guidelines include empiric antibiotic therapy recommendations based on institutional antibiogram data. This concept can be further advanced to include the incorporation of syndromic-specific and/or unit-specific antibiotic recommendations into treatment guidelines. For example, an institution may have a guideline for the management of pneumonia. It would be prudent for the guideline to include empiric antibiotic recommendations based on a patient’s presentation (community versus hospital), hospital location (ICU versus ward), and suspected pathogens. This concept has demonstrated improvement in guideline concordant antibiotic prescribing and reductions in the delivery of ineffective therapy. Eudaley et al. demonstrated that clinicians using CDSS tools increased guideline concordance for empiric therapy by 30%. Notably, integration of these tools reduced the frequency of ineffective antibiotic therapy by 40% in critically ill patients.

Currently, CDSS tools use traditional antibiogram data, resulting in several limitations, including: (a) data may not be real-time in the absence of frequent updates; (b) available data may not reflect current susceptibility patterns for a specific syndrome or hospital location. To overcome these limitations, ASPs should consider an electronic antibiogram (e-antibiogram). An e-antibiogram provides a comprehensive, visual analytic report, resulting in susceptibility maps for pathogens and antibiotics. There is the further ability to stratify data by source of infection, infection acquisition (community versus hospital-acquired), hospital location, and patient characteristics (i.e. age). In addition, an e-antibiogram can be configured to map bug–drug combinations based on pathogen, antibiotic, and infection source. The integration of an e-antibiogram into CDSSs has been shown to be feasible and user-friendly; however, there is a lack of data demonstrating the impact on appropriate empiric antibiotic therapy.

To advance antibiogram data and integration into CDSSs further, patient-specific variables should be incorporated. A weighted incidence syndromic combination antibiogram (WISCA) uses electronic healthcare data to provide real-time decision support by integrating patient characteristics and, subsequently, recommending empiric antibiotic therapy for a specific infectious syndrome. A recently published study determined the impact of WISCA use for empiric antibiotic prescription on hospital length of stay at four hospitals. Study participants included adult inpatients receiving empiric antibiotics for urinary tract infection, abdominal-biliary infection, pneumonia, or non-purulent cellulitis. Antimicrobial stewardship physicians used WISCA and clinical guidelines to provide empiric antibiotic recommendations. There were no overall differences in outcomes, including length of stay (LOS), 30-day mortality, and 30-day readmission among the intervention versus control groups. Guidelines-based interventions were associated with decreased LOS for cellulitis and decreased mortality for community-acquired pneumonia. Although the study failed to show a significant difference in hospital LOS, there were several notable limitations. There was a high frequency of agreement between antimicrobial stewardship physicians and primary prescribers within the intervention arm. Secondly, recommendation acceptance was low, mitigating any potential benefit. Over half of the patients had an infection amenable to source control or were receiving effective therapy initiated within 48 h of culture obtainment. Finally, approximately 90% of patients were admitted to general wards and may have been less susceptible to suboptimal outcomes associated with effective antibiotic therapy delays. The conclusions of the study demonstrate that ASPs have an opportunity to continue to develop and incorporate WISCA-guided recommendations with the goal of improving outcomes for infectious syndromes in which outcomes are closely associated with early appropriate empiric antibiotic therapy.

**Antibiograms and rapid diagnostic technology**

Rapid diagnostic technology (RDT) has revolutionized the management of infectious diseases, allowing antimicrobial stewardship programs the ability to recommend targeted antibiotic therapy, resulting in improved clinical and microbiological outcomes. Many clinical laboratories are using RDT to detect antibiotic resistance genes for diagnostic and surveillance purposes. RDT can be performed directly on clinical specimens, including respiratory and blood; however, routine
antimicrobial susceptibility testing (AST) may or may not be completed as follow-up to confirm resistance determinants results. The incorporation of resistance determinant information into an antibiogram may assist in augmenting early appropriate empiric antibiotic therapy based on the presence or absence of resistance markers. For example, the identification of mecA in Staphylococcus aureus predicts methicillin-resistant S. aureus which allows prescribers to ensure targeted antibiotic therapy.\textsuperscript{30} In contrast, predicting Gram-negative resistance determinants is more complex due to heterogenous mechanisms. Therefore, RDTs may provide lower accuracies of prediction potentially not allowing the administration of targeted antibiotic therapy.

RDT provides earlier organism and key resistance determinant identification; however, information is incomplete, and ASPs may be without a clear direction for intervention in the absence of resistance determinants. Pogue \textit{et al.}\textsuperscript{31} determined the ability of Verigene BC-GN organism identification and resistant determinant presence/absence to predict antibiotic susceptibility among target Gram-negative organisms in order better to direct ASPs. A total of 1046 Gram-negative bloodstream isolates that were analyzed with the Verigene BC-GN platform were assessed. Except for \textit{P. aeruginosa}, the absence of resistance determinants as reported by the RDT largely predicted susceptibility to target antibiotics. Negative predict values (NPVs) for ceftriaxone susceptibility for \textit{E. coli} and \textit{K. pneumoniae} in the absence of either Cefotaxime-Munich (CTX-M) or a carbapenemase gene were 98\% and 93–94\%, respectively. The authors concluded that clinicians may be able to use a similar approach in de-escalating antibiotic therapy in the absence of resistance determinant detection.

Conclusions

Studies have demonstrated that an incorrect empiric antibiotic regimen can be harmful to patients while unnecessary broad-spectrum antibiotics can lead to increased resistance. A primary tenet of ASPs is the establishment of empiric antibiotic recommendations for commonly encountered infections. An important tool in providing empiric antibiotic therapy recommendations is the use of an antibiogram. Numerous antibiogram strategies have been evaluated and shown to improve empiric antibiotic therapy selection, but each strategy has advantages and disadvantages (Table 1). Currently, most institutions use a traditional antibiogram, ASPs have an opportunity to enhance data with the completion of syndromic and WISCA antibiograms. Further, the incorporation of antibiograms into CDSSs at the point of prescribing is imperative to ensure timely administration of appropriate empiric therapy. Future research is warranted on the impact of syndromic and WISCA antibiograms on clinical and microbiological outcomes.

Author contributions

All authors substantially contributed to the conception, drafting, and final approval of the manuscript.

Conflict of interest statement

All authors are employees of Merck Sharp & Dohme Corp., a subsidiary of Merck & Co., Inc., Kenilworth, NJ, USA.

Funding

The authors received no financial support for the research, authorship, and/or publication of this article.

Ethical approval

The study did not require an ethical board approval because it did not contain human or animal trials.

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