# Decreased Antibiotic Susceptibility Driven by Global Remodeling of the *Klebsiella pneumoniae* Proteome

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### In Brief

Keasey et al. investigate the proteomic mechanisms used to circumvent the effect of antibiotics by Gram-negative bacteria that do not harbor traditional genetic elements of resistance. The proteomes of Klebsiella pneumoniae bacteria that survived treatment with antibiotic inhibitors of ribosomal protein synthesis were examined by label-free quantitative mass spectrometry. Taking a systems approach, they identify both common and drug-specific molecular pathways that facilitate decreased susceptibility to antibiotics. These results explain why some antibiotic treatments fail even with sensitive pathogens.



Antibiotic resistance in susceptible *K. pneumoniae* 

# Highlights

- Global proteomic remodeling alters antibiotic susceptibility in K. pneumoniae.
- Drug specific transport, sugar utilization, central metabolism, capsule synthesis.
- Common pathways of reactive oxygen scavenging, turnover of misfolded proteins.
- Integrated adjustments and unique drug-specific features for drug combinations.



# Decreased Antibiotic Susceptibility Driven by Global Remodeling of the *Klebsiella pneumoniae* Proteome\*<sup>S</sup>

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Bacteria can circumvent the effect of antibiotics by transitioning to a poorly understood physiological state that does not involve conventional genetic elements of resistance. Here we examine antibiotic susceptibility with a Class A  $\beta$ -lactamase+ invasive strain of Klebsiella pneumoniae that was isolated from a lethal outbreak within laboratory colonies of Chlorocebus aethiops sabaeus monkeys. Bacterial responses to the ribosomal synthesis inhibitors streptomycin and doxycycline resulted in distinct proteomic adjustments that facilitated decreased susceptibility to each antibiotic. Drug-specific changes to proteomes included proteins for receptor-mediated membrane transport and sugar utilization, central metabolism, and capsule production, whereas mechanisms common to both antibiotics included elevated scavenging of reactive oxygen species and turnover of misfolded proteins. Resistance to combined antibiotics presented integrated adjustments to protein levels as well as unique drug-specific proteomic features. Our results demonstrate that dampening of Klebsiella pneumoniae susceptibility involves global remodeling of the bacterial proteome to counter the effects of antibiotics and sta-Molecular & Cellular Proteomics 18: bilize growth. 657-668, 2019. DOI: 10.1074/mcp.RA118.000739.

As a commensal Gram-negative bacterium that colonizes mucosal surfaces of the gastrointestinal and respiratory tracts, *K. pneumoniae* readily adheres to medical devices, thereby increasing risk of infection for patients undergoing procedures with reused or inserted medical equipment (1, 2), and immuno-compromised individuals are especially vulnerable (3). The emergence of more-virulent and invasive *K. pneumoniae* strains (4) has broadened the susceptible population to include individuals who are healthy and non-immunocompromised. Moreover, the failure of first-line broad-spectrum therapies against clinical

isolates is leading to an increase of infections that are chronic and recalcitrant to treatment (3). Recently, an outbreak of carbapenem-resistant *K. pneumoniae* occurred at the Clinical Center of the U.S. National Institutes of Health, causing the deaths of 11 of 18 affected patients (3). Moreover, an outbreak of chronic and lethal infections that occurred within laboratory primate colonies of *Chlorocebus aethiops sabaeus* (5, 6) was caused by a hypermucoviscous and invasive strain of *K. pneumoniae V513* (*KpV513*)<sup>1</sup>. Animals infected by the *KpV513* strain did not respond to antibiotics, and this outbreak provides a primate model to better understand drug interactions with this emerging bacterial pathogen.

Bacteria can survive antibiotic treatment through acquisition of genetically encoded elements that confer specific resistance or by transitioning to a phenotypic state of resistance that can be experimentally demonstrated by culturing with antibiotic levels that are below the minimum inhibitory concentration (sub-MIC). Further, the termination of antibiotic therapy for chronic infections (7-9) often results in disease relapse because of the resurgent growth of bacteria that survived antibiotic exposure. Previous studies have reported that susceptible Gram-negative bacteria that survive antibiotic treatment exhibit stochastic variations in levels of ppGpp (10) and ATP (11) that coincide with slow growth or states of dormancy. However, many factors must come into play for infection to continue after antibiotic treatment, and it is possible that additional features can be detected by proteomiclevel studies of antibiotic responses. Here we examined population and proteomic dynamics of KpV513 under experimental conditions that replicate phenotypic resistance to disparate classes of drugs.

#### MATERIALS AND METHODS

*Microscopy*-For immunohistochemistry, formalin-fixed and paraffin embedded (FFPE) tissue sections were de-paraffinized using xy-

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Received March 15, 2018, and in revised form, January 4, 2019

Published, MCP Papers in Press, January 7, 2019, DOI 10.1074/mcp.RA118.000739

lene and a series of ethanol washes. The sections were treated with endogenous peroxide and non-specific antibody blocking reagents, and incubated with rabbit anti- K. pneumoniae polyclonal antibody (1:2000, Thermofisher Scientific, Waltham, MA) for 2 h at room temperature. Sections were visualized using a horseradish peroxidaselabeled polymer, Envision + system (anti-rabbit) (Agilent, Santa Clara, CA) subjected to reaction with the chromogen diaminobenzidine. For immunofluorescence, formalin-fixed and paraffin embedded tissue sections were deparaffinized using xylene and a series of ethanol washes. After 0.1% Sudan black B (Sigma-Aldrich, St. Louis, MO) treatment to eliminate autofluorescent backgrounds, the sections were heated in citrate buffer (pH 6.0) for 15 min to reverse formaldehyde crosslinks. After rinses with PBS (pH 7.4), the sections were blocked with PBS containing 5% normal goat serum overnight at 4 °C, and incubated with rabbit anti- K. pneumoniae polyclonal antibody (1:2000, Thermofisher Scientific) for 2 h at room temperature. After rinses with PBS, the sections were incubated with secondary Alexa Fluor 568 conjugated goat anti-rabbit antibody for 1 h at room temperature. Sections were cover slipped using Vectashield mounting medium with DAPI (Vector Laboratories, Burlingame, CA). Images were captured on a Zeiss LSM 780 confocal system (Carl Zeiss Microscopy, Jena, Germany) and processed using ImageJ software.

Electron Microscopy-Bacteria were grown to mid-log phase  $(OD_{600} = 0.5)$  in streptomycin, doxycycline or untreated control medium. The cells were harvested by centrifugation at 5000  $\times$  g for 10 min at 4 °C. Bacteria were fixed at room temperature for 1 h in EM primary fixatives of 2.5% formaldehyde and 2.5% glutaraldehyde in 0.1 M sodium cacodylate (pH 7.4) buffer. For transmission electron microscopy, the fixed bacteria were washed three times for 10 min each in 0.1 M sodium cacodylate buffer, incubated for 1 h in 1% osmium tetroxide in 0.1 M sodium cacodylate buffer, and washed with distilled water for 10 min. The samples were stained for 1 h in 1% uranyl acetate, dehydrated in an ethanol series of 30%, 50%, 75%, and 95%, successively, for 10 min each, followed by three 10 min washes in 100% ethanol and two 10 min washes in propylene oxide. Samples were infiltrated with agitation at room temperature in wellmixed 50% v/v propylene oxide/Epon 812 (Electron Microscopy Sciences, Hatfield, PA, Cat#RT14120) for 1 h, followed by 100% Epon 812 three times for 1 h each. The samples were placed in an oven and allowed to polymerize at 60 °C for 24 h. Thin sections (~80 nm) were collected and pre-stained with 1% uranyl acetate and Sato lead before examination in a JEOL 1011 (Joel USA, Inc., Peabody, MA) transmission electron microscope at 80kV. Digital images were acquired using AMT camera system (Advanced Microscopy Techniques, Corporation, Woburn, PA). For scanning electron microscopy, the fixed bacteria were transferred to filter membranes under vacuum, and washed and dehydrated as described above, excluding the propylene oxide wash steps. The prepared samples were transferred to a critical point dryer to reach critical point dryness, mounted on specimen stubs, and sputter coated with 6 nm iridium. The samples were loaded into Zeiss Sigma field emission scanning electron microscope (Carl Zeiss Microscopy) using 2kV InLens secondary electron detector, and digital images were acquired using SmartSEM software. Two biological replicates were performed for each condition.

Bacterial Cultures and Antimicrobial Susceptibility Testing-Bacterial cultures were grown at 37 °C with 250 rpm shaking in Luria-

Bertani (KpV513, clinical isolates of K. pneumoniae, Escherichia coli, Acinetobacter baumannii) or heart infusion (Yersinia pestis) broth with aeration. After 16h, bacteria were diluted 1:100 in culture broth and grown to the mid-log phase (OD\_{600}\,\sim 0.5) twice to synchronize growth. Plating of serially diluted cultures established that  $5 \times 10^8$ colony forming units (cfu) were present in mid-log phase cultures. Determination of antibiotic minimum inhibitory concentrations (MIC) was performed as previously described (12), in microplate format. Absorbance of each microplate well (200 µl culture) at 600 nm was monitored using a Bioscreen CTM Automated Microbiology Growth Curve Analysis System (Growth Curves USA, Piscataway NJ). The MIC end point was determined as the lowest concentration of antibiotic at which there was no visible growth after 20 h. For isolation of untreated and antibiotic treated cells, replicate wells (n = 6) of KpV513 bacteria in culture  $\pm$  antibiotic at 50% of the MIC concentration ( $MIC_{50}$ ) were harvested at mid-log phase by centrifugation at 5000  $\times$  g for 10 min at 4 °C. Supernatant absorbance was recorded and cell pellets were stored at -80 °C. Six biological replicates were performed for each condition, except for the combination treatment of streptomycin + doxycycline, which was performed in triplicate. Using the string test on doxycycline-treated colonies, which exhibited a distinct mucoid phenotype, hypermucoviscosity was defined by formation of viscous strings > 5 mm long (13). For cyclic administration of antibiotics, untreated or antibiotic treated KpV513 were treated at a low level of detection (*i.e.* at their calculated  $C_t$ , see below) with MIC<sub>50</sub> antibiotics.

Acid Production and Glucose Utilization-K. pneumoniae were cultured untreated or with antibiotic(s) at the MIC<sub>50</sub>, harvested during mid-exponential growth, and centrifuged at 5000  $\times$  g for 10 min to pellet cells. The pH indicator bromthymol blue (0.03%) was added to culture supernatants (n = 3), and absorbance at 620 nm (blue, pH  $\geq$ 7.2) and 425 nm (yellow, pH  $\leq$  6), which are peak absorption wavelengths of the deprotonated and protonated forms of bromthymol blue, respectively, were recorded. Glucose utilization was assessed under hypoxic and aerobic conditions using Hugh and Leifson's oxidation fermentation basal medium (pH 7.1) with glucose as the sole carbohydrate source. Cell pellets were washed twice in antibiotic-free broth and inoculated as stabs into two tubes of oxidative fermentative medium. One tube from each pair was overlaid with mineral oil as a barrier to oxygen diffusion (hypoxic conditions). Tubes were incubated at 37 °C for 5 h and levels of acid production from glucose metabolism were recorded as the percentage of medium within the tube that changed color from blue (pH 7.1) to yellow (pH 6).

Growth Curve Analysis – The time to detectable growth,  $C_t$ , was calculated by fitting an exponential curve to the initial phase of growth and solving for x at  $y = 10^{-6}$ . For predictions using the discrete dynamical systems model, measurements of bacterial population density are denoted by D, where  $D_o$  is the starting cell density and  $D_t$ reflects bacterial density at subsequent time points t. Population density was recorded every 15 min, and t denotes rescaled time, such that each 15 min interval represents one unit of time (t = 0, 1, 2, 3, ...; for t = 3, the corresponding time in the experiment is  $3 \times 15$  min = 45 min). The change in population density  $(D_{t+1} - D_t)$  with time  $((t+1) - D_t)$ t) exhibited a parabolic pattern, in which the population change increased faster than linearly, indicating that the doubling rate of bacteria was greater than the measurement time interval (15 min). Assuming constant rates of cellular division, we expect the population change  $(D_{t+1} - D_t)$  to be a fixed fraction of the population Dt, and the model should be of the form

$$D_{t+1} - D_t = rD_t \tag{Eq. 1}$$

where r is a constant that reflects the proportion of cells dividing during each time interval. We plotted population density *versus* population change for each time interval during the early phase of de-

<sup>&</sup>lt;sup>1</sup> The abbreviations used are: *KpV513*, *Klebsiella pneumoniae V513*; CFU, colony forming units; CPS, capsular polysaccharide; Ct, time to detectable growth; DC, doxycycline; EM, electron microscopy; ESBL, extended spectrum beta-lactamase; LB, luria-bertani; MDK, minimum duration of killing; MIC, minimum inhibitory concentration; PCA, principal component analysis; PMF, proton motive force; SM, streptomycin; TCA, tricarboxylic acid.

tectable growth. The resulting linear line intersects the origin and the slope of the line gives *r*. Here, 15/r yields the dividing time in minutes. In function form, (Eq.1) becomes

$$f(D_t) = (1/r) \times D_t = D_{t+1}$$
 (Eq. 2)

and iterating f, we can express the general solution of the discrete dynamical system for the initial condition  $D_{\alpha}$  as

$$D_t = D_o \times (1/r)^t \tag{Eq. 3}$$

To estimate the proportion of cells that initiated resurgent growth,  $D_o$  of untreated *KpV513* was calculated using (Eq.3). Because *KpV513* cultures were serially diluted such that ~200cfu were inoculated into each microwell, we validated our mathematical model by comparing the theoretical  $D_o$  to the number of cfu experimentally added to culture. Over replicate experiments (n = 6),  $D_o = 200 \pm 25$ cfu. Next, because antibiotic-treated *KpV513* cultures were inoculated with the same stock of serially diluted cells, we used (Eq. 3) to estimate the theoretical  $D_t$  of treated cultures at the untreated  $C_t$ , using *r* from growth of treated cells and  $D_o$  from untreated cultures. Finally, again using (Eq.3), we could estimate  $D_o$  of treated cultures based on the treated theoretical  $D_t$  and *r*.

To describe the effect of decreasing growth rates on culture capacity, we fit a logistic model to measurements of culture absorbance approaching stationary phase. The relative population change was reduced as population size increases, eventually approaching zero as the environmental carrying capacity was reached. Therefore, the relative population change was proportional to the unused carrying capacity, such that

$$\frac{D_{t+1} - D_t = r}{D_t} \frac{(1 - D_t)}{M}$$
(Eq. 4)

For decaying rates of growth, we plotted the relative population change  $(D_{t+1} - D_t)/D_t$  versus the population size  $D_t$ . If  $x = D_t$  and  $y = (D_{t+1} - D_t)/D_t$ , then

$$y = r(1 - x/M) = r - (r/M)x$$
 (Eq. 5)

and the data should lie along a line with slope -r/M and y-intercept of r. We calculated M, which reflects  $M_{initial}$  because it is based on the maximum capacity achieved prior to declining growth rates, and compared it to  $M_{decay}$ , which is the experimentally observed maximum culture density.

Growth curves were derived and integrated for phase-portrait graphs (Fig. 4) using Origin Pro Software (OriginLab Corporation, Northampton, MA).

Imaging Mass Spectrometry—MALDI imaging MS was performed using a Solarix dual source Fourier transform-ion cyclotron resonance (FT-ICR) mass spectrometer (Bruker Daltonics, Billerica, MA) with a SmartBeam II laser operating at 1kHz, a laser spot size of 25  $\mu$ m, and a raster width of 200  $\mu$ m for general profiling. Spectra in positive ion mode were generated using 100 laser shots at a frequency of 1 kHz. Ion images for tissue sections were acquired in 4 h at a peak resolution of ~125,000 (FWHM, *m/z* 400). Following MS analysis, data was loaded into FlexImaging Software focusing on the *m/z* = 700– 3500 range and reduced to 0.98 ICR Reduction Noise thresholds. All data were normalized by root mean squares.

Sample Preparation for Shotgun Proteomics—KpV513 cell pellets were suspended and sonicated for 200 s (10 s on, 10 s off, 10 runs at 20W) in an ice bath of 1 mL ice-cold 25 mM Tris-HCl (pH 7.4, added lysozyme, DNase I, Protease Inhibitor). Sonicated bacterial suspensions were centrifuged at  $5000 \times g$  at 10 °C for 20 min. Supernatants were analyzed by SDS-PAGE (Bio-Rad, Hercules, CA) followed by Coomassie stain, and total protein concentration was determined using the Bradford protein assay (Bio-Rad). 100  $\mu$ g of total cell lysate

was used to generate tryptic digest using the "filter-aided sample preparation" (FASP) protein digestion method (14). *KpV513* proteins in buffer (50 mM ammonium bicarbonate, 8 M urea) were reduced by dithiothretiol and alkylated with 20 mM iodoacetamide in the dark for 1 h. After diluting into 1 M urea, alkylated proteins were digested with trypsin (1:100 w/w, Promega, Madison, WI) at 37 °C for 12 h and cleaned with Stage-Tip prior to 1D-LC-MS/MS (15).

Liquid Chromatography and Tandem Mass Spectrometry-All LC-MS/MS analysis was performed on both Orbitrap Elite and Fusion Classic mass spectrometers (Thermo Scientific, San Jose, CA). 100 ng of desalted tryptic protein digest was loaded onto Acclaim™ PepMap<sup>™</sup> 100 C<sub>18</sub> LC column (Thermo Scientific) using a Thermo Easy nLC 1000 LC system (Thermo Scientific) connected online with Orbitrap Fusion Classic mass spectrometer. After sample injection, the peptides were eluted using LC methods, running 1% to 35% LC gradients of aqueous, formic acid/acidified acetonitrile over 100 min at a flow rate of 300 nl/min. The Fusion mass spectrometer was operated in a data dependent mode in which each full MS scan was followed by 20 data-dependent MS/MS scans. Voltage setting at the nano-spray was set at 2.3 kV for stable spray. Each MS<sup>1</sup> scan was performed in the Orbitrap at a resolution of 60,000, with maximum injection time of 50 ms and AGC target set at  $2 \times 10^5$  counts. For MS<sup>2</sup> scan, a normalized Collison energy setting of 29 was used with a maximum injection time of 75 ms and AGC target set to 1 imes 10<sup>4</sup> counts.

For Orbitrap Elite MS, the desalted tryptic protein digest was loaded onto an Ultimate 3000 HPLC (Thermo Fisher Scientific) with a pulled-tip 75  $\mu$ m  $\times$  15 cm C<sub>18</sub> column (New Objective, PicoFrit column) at a flow rate of 300 nl/min. The peptides were eluted using LC methods as described above. Voltage settings at the nano-spray source were optimized at 2.0 kV to ensure stable fine spray. The cycles of 10 data-dependent MS/MS scans per MS<sup>1</sup> scan were performed. For all collision-induced dissociation (CID) scans, a normalized collision energy of 30 was used, the maximum inject time was 100 ms and maximum ion counts sat to 1  $\times$  10<sup>4</sup> counts for MS<sup>2</sup>. Two technical replicates were performed for each biological replicate. Two biological samples were also tested for comparison of data between two mass spectrometers (Fusion and Elite).

Protein Identification and Quantification-Raw MS data were collected and analyzed using Proteome Discoverer (version 2.2, Thermo Scientific) with Sequest HT search software and MaxQuant (version 1.6.0.1) incorporated with the Andromeda search engine. Each search engine was supplied with a database comprising comprehensive K. pneumoniae protein sequences (downloaded on 9 July 2016, 5126 proteins, Taxonomy 272620) combined with common contaminants proteins. Mass tolerance settings were as follows: fragment ion mass 0.6 Da, parent ion tolerance 10 ppm (Sequest); precursor ion mass 10 ppm and fragment ion mass 20 ppm (MaxQuant). Search settings included trypsin as the digestion enzyme, minimal peptide length of six amino acids, and a maximum of two missed cleavage sites. Carbamidomethylation of cysteine was set as a fixed modification, and N-terminal protein acetylation and methionine oxidation as variable modifications. The maximum false discovery rate (FDR) was set at 1%. Two unique peptides were selected for a protein identification using Sequest. This approach was used in initial analysis stages to ensure that raw data sets had enough proteome depth. Combining data files representing two LC-MS/MS replicates for each biological replicate, the label-free quantitation (LFQ) values derived from the LFQ algorithm in MaxQuant were used for quantitative analysis. Default settings for quantification based on MS peak integration and for normalization among all datasets were accepted. Protein isoforms that could not be discriminated based on unique peptides were reported as a single protein group. Proteins not present in at least 15% of the samples were removed. We used abun-



FIG. 1. *Klebsiella pneumoniae* infection in the large intestine of a *Chlorocebus aethiops sabaeus* monkey. Evaluation of cecum tissue procured during necropsy of a subject that presented multiple abscesses of the gastrointestinal tract and succumbed to *K. pneumoniae* infection. *A,* Immunofluorescence to detect nuclei (blue) and *K. pneumoniae* cells (green). *B,* Collection of ion intensity for the *K. pneumoniae* peptide at *m/z* 1109.554 Da from imaging mass spectrometry. The peptide from aminotransferase ArgD protein co-localized with *K. pneumoniae* cells detected by immunofluorescence in (*A*).

dance distribution-based imputation (ADI) to replace missing values (16, 17). ADI is a randomized imputation method based on normal abundance distribution to simulate a typical abundance region for missing values if experimentally measured (supplemental File S4).

Experimental Design and Statistical Rationale—For statistical analyses, proteomic data were used from six biological replicates of LC-MS/MS analyses for each experimental group except the combination treatment of streptomycin + doxycycline, which was performed in triplicate. A non-parametric (Wilcoxon-Mann-Whitney) test was used to distinguish statistically significant changes between antibiotic-treated and the untreated control *KpV513* cultures. Proteins with *p* value < 0.05 and  $\pm$  2-fold change were considered significant and differentially abundant. A principal component analysis (PCA) was performed in Perseus software, using a minimum peptide cutoff = 20, only proteins present in at least 80% of the spot maps, and a Benjamini-Hochberg procedure with a significance level of 0.05. Differentially abundant proteins in the proteomes of streptomycin- or doxycycline-treated *KpV513* were mapped to cellular pathways using the KEGG database (www.genome.jp/kegg/pathway.html).

### RESULTS

Culture Model of Antibiotic Resistance-The KpV513 isolate, which was a K2 capsular serotype, caused a severe multisystem disease that was unresponsive to cefazolin antimicrobial therapy. The infections reoccurred within the colony, suggesting a chronic carrier state for one or more of the individual animals. We examined tissue samples procured from an animal that presented multiple abscesses of the gastrointestinal tract and succumbed to infection by KpV513. Microscopic evaluation of cecum tissue revealed a significant bacterial burden (Fig. 1A) that was accompanied by the presence of numerous infiltrating macrophages (supplemental Fig. S1). Ion intensity maps of infected cecum tissue, acquired by imaging mass spectrometry, exhibited marked increases in bacterial proteins that co-localized with KpV513 observed microscopically (Fig. 1B and supplemental Fig. S2). For example, the peptide at m/z = 1109.554 (TLVQSTFADK) was detected from the acetylornithine/succinyldiaminopimelate aminotransferase ArgD of KpV513. The bacteria isolated from the infections exhibited a drug resistance profile (supplemental Table S1) comparable to clinical extended-spectrum-betalactamase (ESBL)-*K. pneumoniae* isolates that are associated with fatal human infections. Mass spectrometry (supplemental Table S2, S3) and genome sequencing (19) identified a Class A  $\beta$ -lactamase that was harbored by *KpV513*, which confirmed an ESBL designation for this strain.

We developed a culture model with KpV513 to further examine responses of this invasive strain to antibiotics. In general, the expansion of bacterial populations can be described by four sequential phases: a lag with no detectable change  $(C_t)$ , the initial highest rate of expansion, a decaying rate of expansion, and a stationary phase of growth equilibrium that is limited by the carrying capacity of the culture environment. Because the minimum inhibitory concentration (MIC) represents the drug level that completely blocks growth, 50% of the antibiotic MIC (MIC<sub>50</sub>) was used in broth cultures (Table I). The reduced susceptibility to the penam (ampicillin) and cephem (cefazolin)  $\beta$ -lactams, as well as colistin, was obvious from growth attributes and MICs (Table I). Interestingly, the growth curves for responses to each non- $\beta$ -lactam antibiotic demonstrated specific values for lengthened  $C_t$ , extended time to mid-exponential growth, and maximum cell density (Fig. 2A, 2B). Similar deviations from normal growth characteristics were also evident in the growth curves of clinical isolates of E. coli, K. pneumoniae, and Acinetobacter baumannii, as well as an attenuated strain of Yersinia pestis, that were treated with antibiotics at the MIC<sub>50</sub> (supplemental Table S1 and supplemental Fig. S3). These results indicated that altered growth kinetics are a common response to antibiotics by Gram-negative bacteria and are not specific to only KpV513. A discrete dynamical system method (20) was used to further examine the population responses of KpV513 to antibiotics. For the initial phase of detectable growth in culture, we noted a decrease ( $39\% \pm 8.7\%$ ) in the rate of cell division with antibiotic treatment that directly correlated ( $R^2 = 0.95$ ) with  $C_t$ (Fig. 2C) and estimated that  $\sim$  1.5% (1.4%  $\pm$  0.36%) of total

Growth response of Klebsiella pneumoniae to antibiotic treatment										
Treatment <sup>a</sup>	Class	Mechanism Bacteri-	Target	MIC (µg/ml)	Lag (Ct, hr)	Doubling time (min)	M <sub>initial</sub> (A <sub>260</sub> )	М <sub>десау</sub> (А <sub>260</sub> )	Growth decline (hr)	
Untreated					3.71	21.40	0.86	1.32	12	
Ampicillin*	Penicillin	cidal	Cell wall	>128	3.37	21.79	0.87	1.29	12	
Cefazolin*	Cephalosporin	cidal	Cell wall	4	4.20	30.61	0.77	1.39	14.2	
Meropenem	Carbapenem	cidal	Cell wall	1	15.16	69.25	0.85	1.25	11.1	
Colistin*	Polymyxin	cidal	Cell wall	4	6.65	25.65	0.85	1.32	10.4	
Streptomycin	Aminoglycoside	cidal	30S ribosome	4	7.34	31.84	0.99	1.13	6.5	
Doxycycline	Tetracycline	ostatic	30S ribosome	1	6.35	26.08	2.40	1.00	14.8	
Chloramphenicol*	Amphenicol	ostatic	50S ribosome	16	12.58	79.24	0.93	1.14	8.5	

TABLE I

<sup>a</sup>Growth properties determined at the antibiotic MIC<sub>50</sub>.

\*MIC indicates resistance (ampicillin) and reduced susceptibility (cefazolin, colistin, chloramphenicol).



FIG. 2. Growth of Klebsiella pneumoniae in response to antibiotics that target cell wall synthesis or ribosomal function. Extended spectrum β-lactamase-producing K. pneumoniae were cultured untreated (black), with ampicillin (gray) at the highest tested dose (128 μg/ml), or in the presence of susceptible antibiotics at the MIC<sub>50</sub>. A, Culture growth curves and (B) rates of replication based on first derivative growth curves, overlaid from the time of detectable increases in culture absorbance. C, Relationship between the initial rate of replication and time to detectable increase in optical density in early culture. D, Relationship between culture density accumulated during the decay phase of growth and the relative culture capacity that was normalized to the maximum capacity attained at the highest replication rates during the initial phase of growth (Minitial). E, Principal component analysis of proteins identified by mass spectrometry, for all biological replicates (closed circles) of each treatment condition: streptomycin, SM; doxycycline, DC; combination of SM and DC, SMDC; untreated. F, Culture growth and replication rates (inset) of bacteria tolerant to ribosomal synthesis inhibitors. Coloring is consistent throughout: cefazolin, orange; meropenem, pink; colistin, cyan; streptomycin, blue; doxycycline, red; chloramphenicol, purple; combination of streptomycin and doxycycline, green.

bacteria seeded tolerant cultures, regardless of the specific antibiotic. We observed no difference in cell size between untreated and antibiotic-treated KpV513 by transmission electron microscopy (data not shown), indicating that the

results represented actual population increases. Sampling cell density during the initial highest rate of expansion (Minitial) and the decaying rate of expansion  $(M_{decay})$  provided an indication of the relationship between growth rate and the carrying capacity, which was influenced by the metabolic efficiency of carbon source conversions to biomass and the changing culture environment (pH, temperature, accumulation of toxic products, etc.) (21). Compared with untreated bacteria, antibiotic-treated cells exhibited shortened phases of growth rate decay that directly correlated ( $R^2 = 0.89$ ) with reduced carrying capacity, indicating that antibiotic treatment reduced nutrient-to-biomass conversion efficiencies. For example, colistin treatment resulted in 10.4 h of growth-rate decay, which contributed to an additional population expansion that exceeded  $M_{initial}$  by > 50%, whereas cultures treated with doxycycline exhibited a negligible growth decay phase that did not expand past  $M_{initial}$  (Table I, Fig. 2D). Antibiotic-treated cells that were cultured with fresh antibiotic-free media reverted to the original drug susceptibility profiles (data not shown).

Drug-specific Mechanisms of Resistance-Because the culture growth curves exhibited by antibiotic-treated bacteria appeared to be unique to each antibiotic (Fig. 2A-2D), we reasoned that the proteome should display the steady-state composition of resistance, as measured by quantitative mass spectrometry (MS). We focused on the bactericidal streptomycin (SM) and bacteriostatic doxycycline (DC), which both impair protein synthesis by binding to the 16s rRNA component of the 30S ribosomal subunit, but differ in class (Table I), structure (Fig. 3), and mechanism of transport across bacterial membranes. The MS analysis of untreated and antibiotictreated cells expanded the experimental coverage of the 5126 predicted bacterial gene products to 32% (1654), and included 614 open reading frames that encode orphan proteins predicted solely by gene annotation algorithms with no previous evidence of protein-level existence or known biochemical function (22). Antibiotic treatment resulted in substantial changes to the proteome that were reproducible across independently-cultured populations (supplemental Fig. S4 and S5), and these global effects were also highly specific to each antibiotic (Fig. 2E), indicating transition from the steady-state control to new proteomic trajectories. As ribosomal function is the primary target of DC and SM, treated bacteria should demonstrate alterations of the translational machinery that compensate for the toxic effects of these antibiotics. Compared with control and DC-treated bacteria, total ribosome content, quantitated as the average abundance of 54 ribosomal subunit proteins (109.3% of untreated for DC versus 78.1% for SM), was significantly decreased (p value <0.00003) in SM-treated cells. Levels of the alarmones ppGpp and pppGpp ((p)ppGpp)), which influence protein allocation and control ribosomal synthesis (23, 24), are regulated by the activity of ReIA and SpoT. ReIA is recruited to stalled ribosomes where it converts GTP and ATP into pppGpp, whereas SpoT degrades ppGpp to GDP, releasing phosphate. We observed elevated levels of ReIA for both DC and SM-treated cells and increased (~2-fold) SpoT for DC-treated cells, suggesting a supportive role for alarmones in stabilizing the new

proteomic trajectories. We further noted that bacteria that resisted SM, but not DC, exhibited substantially elevated levels of proteins that are transcriptionally regulated by alternative stress-response sigma factors (25) (supplemental Fig. S6, supplemental Table S2, S3). Sigma factors are multidomain subunits of bacterial RNA polymerase that compete for binding to a limited number of holoenzymes and have essential roles in promoter recognition and initiating steps of RNA synthesis.

Antibiotic Transport-We hypothesized that resistance should include off-target mechanisms because the antibiotics examined must first traverse the double membrane of Gramnegative bacteria and move through the cytoplasm before reaching the ribosomal targets. Intracellular transport of SM and similar aminoglycosides involves unknown receptors and requires a proton-motive force (PMF) that is driven by the aerobic electron transport chain (26), whereas DC requires porin channels that normally accommodate sugar carbon sources (27). Therefore, we examined changes to the membrane that may limit intracellular transport of antibiotic. SMtreated bacteria exhibited elevated levels of fumarate reductase (FrdAB), which is transcriptionally activated under anaerobic conditions and reverses the tricarboxylic acid (TCA) cycle sequence from succinate to fumarate (28) (Fig. 3A and supplemental Table S2, S3). Furthermore, SM-treated cells had increased abundance of the lysine decarboxylase CadA, which plays a role in pH homeostasis by consuming protons and neutralizing the acidic products of carbohydrate fermentation, as well as proteins (GhrAB, TrpC, KPN 04670, KPN\_04772, YhbL, Tsa) involved in the conversion of reactive electrophilic species to non-reactive small carbon compounds. The 2-4 carbon acidic intermediates can enter central metabolism and contribute to diminished aminoglycoside susceptibility by decreasing PMF and TCA activity (29). In contrast to SM treatment, DC-treated bacteria had decreased abundance of the outer-membrane porins LamB (maltose) and OmpC (glucose), as well as the proteins MalE and MalM, which are required for maltose transport across the periplasmic space (supplemental Table S2, S3). Because carbohydrate influx was likely to be dissimilar between SM- and DC-treated cells, we examined growth under aerobic or hypoxic conditions, using minimal medium with glucose as the sole carbon source. Accumulation of SM decreases under anaerobic metabolism (30), and SM-treated bacteria exhibited highly acidic culture supernatants (supplemental Fig. S7A) resulting from an increased fermentative utilization of glucose (supplemental Fig. S7B). Reduced antibiotic transport for DCtreated bacteria was a likely consequence of decreased glucose utilization (supplemental Fig. S7B). Collectively, these results implicated a reduction in intracellular accumulation for both antibiotics.

The Proteomic Transition to Resistance-To compensate for changing membrane PMF or sugar permeability, downstream proteomic remodeling of central metabolic pathways



Fig. 3. **Antibiotic-specific biochemical pathways of resistance.** Proteins that exhibited significant changes in abundance ( $\pm$ 2-fold compared with untreated cells; *p* value < 0.05) in (*A*) streptomycin or (*B*) doxycycline-treated cells were mapped to molecular pathways by functional network associations (glycolysis, green; transcription and translation, gray; removal of reactive oxygen species (ROS), red; iron-sulfur (Fe-S) cluster biogenesis, blue; nitrogen cycle, tan; fatty acid biosynthesis, purple; arginine cycle, pink; tricarboxylic acid (TCA) cycle, yellow, capsular polysaccharide (CPS) biosynthesis, orange). Regulation of pathway reactions by proteins exhibiting unchanged (black vector), increased (green vector), or decreased (red segment) abundance. Selected cellular proteins are designated by shape: outer membrane porins (oval dimers), components involved in electron transport (pentagon), protein synthesis (oval), or removal of ROS (circle). The protein color is identical for pathway regulation that is common to both antibiotics, and subdued with red dashed borders if down-regulated in one treatment *versus* the other.

was apparent in SM and DC-treated bacteria. Aligned with reduced import of sugars, resistance to DC involved a reduction in glycolytic enzymes (Fig. 3*B* and supplemental Table S2, S3),

whereas the TCA cycle was likely enhanced by the increased abundance of key enzymatic steps, mainly succinate dehydrogenase Sdh and malate dehydrogenase Mqo. In contrast

to DC treatment, the increased gluconeogenesis and glycolytic enzymes observed in the SM-treated bacteria are essential for synthesis of glucose-6-phosphate from small carbon compounds as an alternative to C<sub>6</sub> sugars (31, 32), and it is possible that accelerated utilization of glucose compensated for the lower energy yield that resulted from a shift to anaerobic metabolism (Fig. 3A; supplemental Fig. S7 and supplemental Table S2, S3). Additionally, elevated levels of phosphoenolpyruvate synthesis enzymes suggested a necessity to breakdown the accumulated byproducts of fermentative metabolism, including  $C_3$  and  $C_4$  compounds or substrates that entered central metabolism via acetyl-CoA, such as acetate, fatty acids, and ethanol (33) (Fig. 3A and supplemental Table S2, S3). We further observed increased prevalence of TCA cycle enzymes that do not require NAD<sup>+</sup> (PoxB, AcnA, and others) (Fig. 3A and supplemental Table S2, S3). Preferential up-regulation of TCA reactions that do not generate NADH will result in an increased ratio of intracellular NAD<sup>+</sup>/NADH, potentially leading to increased tolerance to bactericidal antibiotics because of decreased superoxide generation (34). Notably, reduced hydroxyl radical formation and elimination of H<sub>2</sub>O<sub>2</sub> induced by antibiotics was likely mediated by elevated levels of the bacterioferritin Bfr (35) and the DNA-binding protein from starved cells Dps (36, 37). Several components for turnover of arginine and histidine were also elevated in SM-treated bacteria (Fig. 3A and supplemental Table S2, S3). Curiously, ArgD of the arginine cycle was elevated in SM-treated cells, and this protein was also detected in tissues from infected monkeys (Fig. 1). Ammonia is the preferred nitrogen source of Gram-negative organisms, and it is possible that amino acid turnover leads to increased generation of this product (38).

The capsule of hypermucoviscous K. pneumoniae strains is a major virulence factor that provides protection from lethal serum factors and resistance to phagocytosis (39, 40). DC, but not SM, induced dramatically elevated levels of the capsule biosynthesis cluster (cps) encoded proteins GalF, Wza, and Wzi (Fig 3B and supplemental Table S2, S3) that are required for polysaccharide export and stabilization. The wzi gene is found only in bacteria that assemble capsular polysaccharide (CPS) (41), and deletion of wzi from capsule-producing strains of K. pneumoniae results in decreased bacteria-associated CPS and increased secretion of CPS into the extracellular environment (40). Based on the changes in proteins for production and efflux of capsule, we anticipated an elevated level of capsular polysaccharide in DC-treated cells. Indeed, the DC-treated bacteria exhibited 5-fold higher hypermucoviscosity compared with untreated cells (supplemental Fig. S7), and presented a mesh-like network of polymers that protruded from outer cell membranes (supplemental Fig. S8). Compared with DC-treated bacteria, CPS chains produced by untreated cells were shorter and loosely associated with the cell surface (supplemental Fig. S8). In contrast to DC- and un-treated bacteria, no CPS was detectable in SM-treated cells (supplemental Fig. S7C, S8B). Further, increased abundance of proteins encoded outside the *cps* locus that are necessary for production of CPS precursors indicated an extensive enhancement of the CPS synthesis pathway in DCtreated cells. This change included enzymes for peptidoglycan synthesis and recycling (MurBC, Alr, and others), as well as proteins for generation of phosphoenolpyruvate (Fig. 3B).

Susceptibility to Combination Antibiotics-Because resistance to SM resulted in unique biochemical pathways that were not likely to be compatible with DC resistance, we examined bacteria that were resistant to a combination of both antibiotics (SMDC). A novel proteome composition for dual antibiotic treatment was suggested by growth curves that were intermediate between those of individual drug treatment (Fig. 2F, supplemental Table S2, S3). SMDC-treated cells comprised protein aspects that were in common with both drugs, as well as unique signatures (Fig 2E; supplemental Fig. S5, S9), accounting for significant changes to 634 proteins. In all antibiotic treated cells, we observed elevated levels of proteins that link sulfur metabolism to cysteine biosynthesis and the "Cys/Cyss shuttle system" (CysABCDHI-JKNP, Sbp, FliY; Fig. 3, supplemental Fig. S9) that cycles cytoplasmic cysteine and periplasmic cystine to eliminate H<sub>2</sub>O<sub>2</sub> (42, 43). In comparing drug-specific mechanisms, SMDC-treated bacteria exhibited a decreased abundance of glucose import and utilization proteins (Gcd, OmpC, LamB, MalEM) that correlated with more aerobic utilization of glucose (supplemental Fig. S7B). Levels of CPS export proteins (Wza and Wzi) were lower for SMDC than DC-treated bacteria, resulting in a proportionate reduction in synthesized CPS (supplemental Fig. S7C, S8D). Specific SMDC signatures included decreased abundance of membrane proteins for the uptake of glycerol (GlpF), potassium (TrkA), and small molecules (OmpF), and increased abundance of the inner membrane proteins FtsK and ZipA, which are essential for cell division (supplemental Fig. S9). Moreover, a unique mechanism to compensate for stalled translation in the dual drug treatment was suggested by elevated levels of the ribosome biogenesis GTPase RsgA that is essential to maturation of the 30S ribosomal subunit and decreased abundance of the transcriptional repressor of methionine synthesis MetJ, which could increase initiation of translation (supplemental Fig. S9).

We considered the possibility that proteomic remodeling boosts the ability of bacterial populations to survive successive exposure to the same antibiotic. Simulating antibiotic use in the clinic, we examined population responses of resistant bacteria that were re-treated with antibiotics at concentrations of 0.5–2.0 MIC. Fig. 4 shows population expansion as a function of time and drug concentration. The addition of SM or DC to sensitive (untreated) cultures resulted in declining rates of replication and reduced carrying capacity that corresponded with increasing concentration of drug (Fig. 4A), whereas high doses of ampicillin (>60  $\mu$ g/ml) did not affect cell proliferation or maximum culture density of the resistant



Fig. 4. Proteomic remodeling boosts survival during successive exposures to the same antibiotic. Cultures of (A) untreated, (B) ampicillin resistant, (C) streptomycin treated, and (D) doxycycline treated extended spectrum  $\beta$ -lactamase-producing K. pneumoniae were treated with streptomycin (left column), doxycycline (middle column), or ampicillin (right), using 0.5–2× the minimum inhibitory concentration. Low (blue) to high (red) accumulated culture density; slow (gray) to fast (black) replication rate.

bacteria (Fig. 4*B*). Remarkably, cultures of antibiotic-treated cells retreated with the same drug exhibited a resurgence in growth rates at concentrations > MIC that contributed to recovery of accumulated capacity with time (Fig. 4*C*, 4*D*), indicating an increase in drug-specific resistance. With SM-treatment, for example, the contour of low to high maximum culture capacity shifted vertically as the treatment dose of SM was increased (Fig. 4*C*), reflecting a shift to a higher level of resistance (Fig. 4*B*). However, we observed a horizontal collapse of SM-treated culture capacity with the addition of increasing concentrations of DC (Fig. 4*C*), indicating that sensitivity to DC was retained. Similarly, resistance to increasing concentrations of DC was exhibited by DC-treated bacteria (Fig. 4*D*), along with continued sensitivity to SM. Given the

diversity of proteomic adaptations exhibited by SM- and DCtreated bacteria, it is likely that the drug-specific protective mechanisms established early in culture favored survival upon repeated exposure to the same drug. Interestingly, DCtreated cells exhibited decreased sensitivity to the highest treatment dose of SM (Fig. 4*D*), and after an extended lag phase (~5 h) the growth curve resembled SM treatment more than DC treatment (data not shown), possibly because of the switch from DC- to SM-resistance.

#### DISCUSSION

The *K. pneumoniae* examined in our study harbors a plasmid-expressed  $\beta$ -lactamase that renders this bacterium resistant to most  $\beta$ -lactams, a class of antibiotics that contain a



Fig. 5. Activated proteomic compartments of bacteria that are resistant to antibiotics targeting the ribosome. *A*, Susceptible bacteria treated with streptomycin or doxycycline; *B*, Decreased susceptibility to streptomycin, *C*, doxycycline, or (*D*) the combination of streptomycin and doxycycline, showing mechanisms that are shared with streptomycin (blue) or doxycycline (orange), or common to both antibiotics (green).

four-membered  $\beta$ -lactam ring that is structurally similar to the D-Ala-D-Ala moiety of the natural substrate (44). Growth of this ESBL isolate in response to non-carbapenem  $\beta$ -lactam antibiotics was identical to untreated controls (Fig. 2A, 2B), indicating that the toxic challenge was very efficiently resolved by  $\beta$ -lactamase activity. The antibiotics that we studied in detail have roughly the same mechanism of action but differ completely in chemical structure. SM is an aminoglycoside antibiotic that interacts with the small 16S rRNA of the 30S ribosomal subunit to inhibit binding of formyl-methionyltRNA (45), and the tetracycline class antibiotic DC inhibits binding of aminoacyl-tRNA to the mRNA-ribosome complex of the 30S subunit (46). The divergence between bacteria that grew in the presence of either DC or SM indicated that chemical structure was a primary driver of the global proteomic remodeling (Fig. 5). Although retreatment of bacteria with the same antibiotic produced upward shifts in MICs, antibiotic treated cultures reverted to the original drug susceptibility profiles upon removal of antibiotic and culturing with fresh

media, confirming the reversible nature of the proteomic remodeling (47, 48).

Instead of focusing on the first generation of surviving bacteria (49), we examined progeny cells that grew out from antibiotic-treated populations. Random precursors should have a selective advantage over the rest of the population, and these bacteria expand in number to rapidly overtake less fit bacteria. By starting cultures with  $\sim$ 200 bacteria that were synchronized in replication, we minimized the possible contribution of dormant and dying cells or chemical communication between cells. A framework was recently proposed (49) for classifying the drug response of bacterial strains by measurement of the MIC together with a quantitative indicator of tolerance, the minimum duration for killing (MDK). The reported range for tolerant precursors based on the MDK is 0.001 - 10% (50), whereas  $\sim$ 1.5% of the bacterial population in our model give rise to resistant bacteria. Instead of a stable metric, it is conceivable that the frequency of precursors represents the inherent heterogeneity of the total bacterial population or the

multiple distinct cellular physiologies within a population (51). Disproportionate partitioning of the proteome (52, 53) or (p)ppGpp-like signaling molecules in daughter cells during replication as a bet-hedging strategy will ensure fitness of the overall population in unstable environments.

Compared with single antibiotic efficacy, combination therapies attempt to use antibiotics with independent mechanisms of action, generally a  $\beta$ -lactam and an aminoglycoside. Combining two or more antibiotics as a treatment option can result in additive and synergistic activities that potentially reduce the likelihood of the emergence of resistant bacteria, whereas antagonistic effects may lower efficacy. However, selecting antibiotics for the most efficacious combination therapy is empirical (54) or based on trial and error. Adjusting the chemical properties of antibiotics to improve accumulation within Gram-negative pathogens can convert ineffective compounds into highly active antimicrobials (55). In a similar manner, proteomic adjustments of the bacteria responding to one antibiotic can alter antibiotic properties of a second compound. From our results, resistance to combination treatment with two antibiotics was mediated by both drug-specific and unique mechanisms (Fig. 5), perhaps because some components of the remodeled proteomes that were necessary for survival in the presence of a one drug may increase susceptibility to the other drug. These results further suggest that antibiotics with similar molecular targets but different chemical structures may be useful for combination therapies if used under conditions that do not promote resistance.

### DATA AVAILABILITY

The mass spectrometry proteomics data have been submitted to the ProteomeXchange Consortium via the PRIDE data repository (18) with the dataset identifiers PXD005587, PXD009175, and PXD010244. In addition, data sets can be visualized in MS-viewer (http://msviewer.ucsf.edu/prospector/ cgi-bin/msform.cgi?form=msviewer) with the following search keys: lyhdoz5qdr, ljjmcsbhke, kqlulgtl0v, lyibssyves.

\* This research was supported in part by an appointment of SLK to the Postgraduate Research Participation Program administered by Oak Ridge Institute for Science and Education through an interagency agreement with the U.S. Department of Energy. Opinions, interpretations, conclusions, and recommendations are those of the authors and are not necessarily endorsed by any Agency or branch of the U.S. government.

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S This article contains supplemental material.

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Author contributions: S.L.K. and R.G.U. designed research; S.L.K., M.-J.S., S.D., C.D.B., X.Z., T.A., and M.G.S. performed research; S.L.K. and M.-J.S. analyzed data; S.L.K., M.-J.S., and R.G.U. wrote the paper.

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