## Day 1 Agenda

Keynote Session: Overview of challenges in discovery of Gram-negative antibacterials

- Lynn Silver, LL Silver Consulting
- Hiroshi Nikaido, University of California Berkeley

Session 1: Barriers to compound penetration and efflux avoidance MODERATOR: Richard Lee, St. Jude Children's Research Hospital

- John Finn, former Trius Therapeutics
- Wright Nichols, former AstraZeneca
- Hiroshi Nikaido, University of California Berkeley
- Lynn Silver, LL Silver Consulting

Session 2: Case studies: Finding ways to overcome barriers to compound penetration and efflux avoidance

MODERATOR: Carl Balibar, Merck

- Fred Cohen, Achaogen
- Erin Duffy, Melinta Therapeutics
- Ruben Tommasi, Entasis Therapeutics

## Day 1 Agenda

Session 3: Enabling technologies to measure compound permeability and accumulation

MODERATOR: Alita Miller, Entasis Therapeutics

- Kyu Rhee, Weill Cornell Medical College
- Derek Tan, Memorial Sloan Kettering Cancer Center
- Helen Zgurskaya, University of Oklahoma

Session 4: Establishing physicochemical guidelines for compound entry & efflux MODERATOR: Troy Lister, Spero Therapeutics

- Heinz Moser, Novartis
- Lynn Silver, LL Silver Consulting
- Mathias Winterhalter, Jacobs University Bremen, Innovative Medicines Initiative Translocation project (presentation not included)

## Keynote Session: Lynn Silver, LL Silver Consulting

### Overview of challenges in discovery of Gram-negative antibacterials



Lynn Silver, PhD LL Silver Consulting, LLC



## Challenges...

- It's hard enough to discover ANY developable novel antibacterials
- Let alone anti-GN agents

- Although note that it's pretty easy to kill bacteria with toxic stuff
- First point: Selectivity is paramount

## **Empiricism vs Rationalism**

- We're scientists
- We're rational
- But most antibiotics (antibacterials) have been discovered empirically

 And rational approaches haven't worked so well...yet

### The "Innovation gap" in novel classes Obscures the "Discovery void"



Between 1962 and 2000, no major classes of antibiotics were introduced No registered classes of antibiotics were discovered after 1984





## One problem is targets

- Single-enzyme targets are generally subject to rapid resistance development
- Choosing "multi-targets" and/or avoiding resistance-prone targets is paramount

Where are the targets located?
– Often in the cytoplasm





- Since the major permeability difference between GN and GP the OM...
- And OM-permeable and efflux $\Delta$  GNs are sensitive to many GP drugs
- Some assume finding ways of crossing the OM and avoiding efflux will allow GN entry
- But novel compounds (such as cytoplasmic enzyme inhibitors) need qualities that also permeate the CM.

### GN barriers (simplistic view)



- OM excludes hydrophobic and hydrophilic compounds.
- Penetration of hydrophilic compounds through OM is via:
  - general porins [<600 MW, prefer hydrophilic, charged]</p>
  - facilitated diffusion of specific hydrophilic solutes [OprD, Tsx]
- But hydrophilic and highly charged molecules entering the periplasm
  - penetrate the CM slowly or not at all
  - unless actively transported [or via PMF]
- Molecules that do enter can be effluxed
- What molecules can accumulate in the GN cytoplasm?

## How to get compounds into the cytoplasm of GNs

- Proposals for studying and overcoming the barriers to Gramnegative entry focus on
  - Processes of periplasmic entry and residence
  - Substrate characteristics of porins, pumps and permeases
  - This will benefit periplasmic targeted compounds
- But compounds designed to get to the periplasm will be unlikely to get to the cytoplasm since
  - sieving properties of OM and CM are more or less orthogonal
  - (effluxability may correlate with CM diffusibility)
- Dependence on transporters is resistance-prone
- Is there a Gestalt approach to solve the simultaneous equations of entry through both membranes and efflux avoidance?

### In addition to characterizing barriers, characterize compounds

- Can we develop rules for entry by studying existing compounds?
- In 2008, O'Shea and Moser analyzed physicochemical characteristics of registered antibacterials making the distinction between GN and GP actives and noted general physicochemical differences between them.



- Now focus on compounds getting into the cytoplasm
- And how they get there

Adapted from O'Shea, R. O. and Moser, H. E. (2008) J. Med. Chem. 51:2871-2878.



- Diffusion (no transporters)
  - Hydrophilic molecules: Cross OM rapidly via porins, may avoid efflux –poor CM passage
  - Lipophilic molecules: Cross OM slowly, can be effluxed good CM passage
- Active transport
  - Hydrophilic molecules cross OM via porins, CM via transporters [ATP or PMF driven]
- Self-promoted uptake [SPU] through OM
  - Cationic molecules, avoid efflux; CM passage via  $\Delta \psi$  or polycations may disrupt CM
- Trojan horse
  - Piggyback on active or facilitated transport; must avoid rapid resistance
- [• OM permeabilizers and EPIs as adjuncts ]
  - Combine with CM-transiting molecules [properties of GP drugs]



MW

### What to do?

- Survey molecules for entry into G- cytoplasm
  - Use activity-independent measurement of cytoplasmic accumulation
  - Study knowns first, then large diverse chemical library
  - Focus on compounds not actively transported
  - Formulate hypotheses/rules correlating physicochemistry with cytoplasmic entrance
  - Synthesize new chemicals to test hypotheses
  - Make large "Gram-negative" chemical library following "rules"
- Extend studies of CM diffusion of ionic species
- Explore self-promoted uptake
- Study many GN species
- Do permeabilizers and Trojan horses work?

## **Exploit Natural Products**

- Source of the majority of antibacterial agents.
- Evolved for the task.
- Do natural products enter GNs well?
  - Many use permeases and illicit entry
    - Which may make them subject to rapid resistance
    - But this should be revisited
- Important to continue to explore NPs
  - Unculturables
  - Genome mining
  - Hypersensitive screening

### Transported compounds that might be able to enter by diffusion





	MW	ClogD7.4
bacilysin	270	-4.49
negamycin	248	-5.87
streptozotocin	265	-1.45
nojirimycin	179	-2.37
D-cycloserine	102	-1.85
fosfomycin	138	-5.99

## Proposal

- Approach the GN entry problem by studying both barriers to entry and characteristics of compounds that accumulate in the cytoplasm
- Require activity-independent measure of accumulation in cytoplasm
- Test whether physicochemical and/or structural descriptors correlate with routes of entry into the cytoplasm.
- If rules can be deduced, make GN-specific libraries

## Keynote Session: Hiroshi Nikaido, University of California Berkeley

# Can we predict the permeation rates of drugs across the outer membrane?

Hiroshi Nikaido University of California, Berkeley

nhiroshi@berkeley.edu

### **Outer Membrane is an Effective Permeability Barrier**



#### **Outline of Presentation**

- 1. E. coli Outer Membrane: Permeation through Porin channels
  - 1.1.1  $\beta$ -Lactams
  - 1.1.2 Other compounds (Quinolones, aminoglycosides, tetracycline)
- 2. Relatives of *E. coli*, e.g. *Enterobacter cloacae*, *Klebsiella pneumoniae*
- 3. Non-fermenters (Pseudomonas aeruginosa, Acinetobacter baumannii)
- 4. Entry through the Asymmetric Bilayer Region
- 5. Endogenous, Constitutive, RND-type Efflux Pumps

#### $1.1.1\,\beta$ -lactams through OmpF porin channels of E. coli

Cephalosporin Permeation Across OM Can Be Determined Precisely in Intact Cells By Combining It With Subsequent Hydrolysis in Periplasm: A Strong Effect of Hydrophobicity



Nikaido, Foulds, and Rosenberg J. Bacteriol. 153: 232 (1983)

In 1983, the presence of drug efflux systems was not known in bacteria. However,

- 1. In 2009 we determined the efflux kinetics of cephalosporins in E. coli. (Nagano and Nikaido, PNAS 106:5454-5458). Because the  $K_{0.5}$  values for the efflux of most cephalosporins are quite high (cephalothin (90  $\mu$ M) and cephamandole (20  $\mu$ M)), we can show that efflux made very little difference in our 1983 data.
- 2. We also tested more compounds by proteoliposome swelling assay, which is not affected by efflux, of course. (Yoshimura and Nikaido, AAC 27: 84 (1985))



Plotting the data against xlogP3, however, produced a horrible fit.

(To avoid negative exponents of 10, PC is henceforth always shown in nm/s, rather than the usual cm/s)

#### How logP values are calculated is CRUCIAL



The near perfect correlation with clogP on the right also shows that the permeability cannot be determined by "specific" interactions between the drug and the channel.





#### What about zwitterionic compounds?



No negative effect of hydrophobicity for zwitterionic compounds?? The situation becomes clear when we examine compounds with one positive and two negative charges.



All compounds with net -1 charge

Zwitterionic Compounds are Simply Too HYDROPHILIC!

What about DIANIONIC compounds?

They are only modestly less permeable (logPC mostly between 2.5 and 2.0) than the hydrophilic compounds with -1 net charge (between 3.0 and 2.5)



Why does not the MW influence the permeation rates of cephalosporins?



Cephalosporins may be thought of as a connection of three cylinders. The central part containing the nucleus is the widest (about 8 Å), although it is thin. Thus cephalosporins can pass through the narrowest part of OmpF channel (7 x 11 Å). In compounds with higher molecular weights, additional atoms are present in two outside cylinders. The zwitterionic cephaloridine diffuses somewhat (1.7 x) faster than the disaccharide lactose with the diameter of about 8 Å). (Nikaido and Rosenberg, 1981; 1983) Does the SPECIFIC interaction of drugs with the channel determine the diffusion rate? For example, the influential review by Pagès, James, and Winterhalter (Nat Rev Microbiol 2008) argues that the diffusion rate can be calculated by the simple formula  $J = [k_{on}/(2 + K \Delta c] \cdot \Delta c$  where  $k_{on}$  is the association rate constant for the specific binding site.

This is still quite controversial.

1. This theory does not explain how simple sugars such as arabinose diffuses extremely rapidly through porin channels.

2. This theory comes from a blind application of what has been done with LamB (a channel SPECIFIC only to maltodextrins and relatives) to essentially NONSPECIFIC PORINS. Specific channels bind ligands with  $K_D$  between 0.2 (FadL) to 60 (maltopentaose for LamB)  $\mu$ M. In a striking contrast,  $K_D$  for AMP in OmpF is about 1 M! With such a large difference, "quantity changes into quality". SPECIFIC CHANNELS are NOT PORINS!

OM Permeability Prediction.

- 1. If SPHERICAL, measure radius of gyration in VMD ("measure rgyr"). If CYLINDRICAL, measure radius of the largest cylinder.
- 2A. If these are larger than 6 Å, consider diffusion through bilayer (discussed later)
- 2B. For compounds with the hydrated radius of around 5Å, go to 2C.
- 2C. If clogP (BioLoom) is <-1.0, the base logPC≈3 for zwitterions. For cpds with -1 net charge, subtract 0.5. For dianionic cpds, subtract 0.5 again. For each net positive charge, add 0.5.
- 2D. If clogP >-1.0, logPC decreases by 0.67 for an 1.0 increase of clogP.
- 3. For smaller compounds, the predicted logPC increases according to the figure on the right.



Azlocillin was not included in our analysis. Its clogP is 1.56, from which we predict the Permeability Coefficient of 16 nm/s. At its MIC of 16  $\mu$ g/ml or 35 nmol/ml, Influx rate predicted = PC\*A\* $\Delta$ c where A is the surface area for 1 mg (dry weight) *E. coli*. This results in the rate of 16 x 10-7 x 132 x 35 = <u>0.007 nmol/s/mg</u>.

When azlocillin efflux was measured by Lim and Nikaido (2010), it was found to follow a sigmoidal curve with the  $V_{max}$  of 0.4 nmol/mg/s,  $K_{0.5}$  of 1  $\mu$ M, and the Hill coefficient of 4.

At its MIC, the periplasmic concentration should be enough to inhibit the most sensitive PBP (in this case PBP3). IC50 for azlocillin is  $0.15 \,\mu$ g/ml, or  $0.3 \,\mu$ M (Lei & Li, Acta Pharmacol Sin 10:177, 1989). At this concentration, the efflux rate is <u>0.003 nmol/s/mg</u>.

This is a very good agreement, especially when we consider that more than IC50 is probably needed to get a complete inhibition of growth.

#### Linezolid: An apparent exception that proves the rule?

Linezolid is a rigid straight cylinder with the radius of only 4Å. And it is not that hydrophobic (clogP =0.42).



So our prediction scheme would predict a reasonably fast permeation with a PC of 80 nm/s, or half-equilibration time of about 3 seconds. But its gram-negative MIC values are very high, and the LC/MS study of Zhou et al. (Anal Chem 2015) showed the half-equilibration time in a  $\Delta$ tolC strain to be around 15 min.

OmpF channel is not a straight cylinder, and large ligands must be flexible, as in cephalosporins, to pass through the channel. A RIGID cylinder like linezolid has little chance for permeation.





#### **Predicted Permeation Rates of A Few Common Agents**

Ciprofloxacin

pKa = 6.3clogP = -0.47

Predicted logPC is close to that of cefoxitin, i.e. 2.5



 $t_{1/2}$  measured by Mortimer & Piddock (1991) (with norfloxacin) was about 10 s. This corresponds to logPC of 1.3. In the fluorescence assay using norfloxacin (Cama et al., JACS 2015), permeation rate of 10 molecules/s/OmpF trimer (at the gradient of 1 mM) was obtained. This corresponds to logPC of 1.6 and  $t_{1/2}$  of about 5 s.

Gentamicin

3 or 4 + charges clogP=-2.4

Predicted logPC is >3.5.



Liposome swelling data by Nakae & Nakae (1982) is often cited, but the results are meaningless as they did not know that charged compounds cannot be used in simple swelling assays. However, the permeability is likely to be very high, as multiple positive charges should pull aminoglycosides into periplasm following the interior-negative Donnan potential.
#### Influx of Tetracycline





Tetracycline is hydrophilic (clogP = -2.46), and seems to be barely able to diffuse through OmpF. Although it has several proton-releasing groups, use of microscopic dissociation constants tells us that up to 7% of Tc exists as an uncharged species at neutral pH (Nikaido & Thanassi, AAC 1993).

Indeed Tc accumulation in *E. coli* is largely dependent on porin.

(It also seems to diffuse with significant rate through the OM bilayer, but this is likely caused by its permeabilization caused by the absence of the major OM protein OmpF.) It seems to be very rapid, with  $t_{1/2}$  of less than 30 sec.

Simulation by solving two simultaneous differential equations suggested the PC across the outer membrane of 10<sup>-5</sup> cm/s, or 100 nm/s, although some of our assumptions are now known to be incorrect. This is only one order of magnitude lower than that predicted from our "rule".

# There are often huge differences in OmpF channel size in different species



This very important aspect of porin physiology needs MUCH more study. We especially need crystal structures of OmpFs from *E. cloacae* and *K. pneumoniae*.

#### Slow Porins in Non-Fermenters (P. aeruginosa, A. baumannii)

The nonspecific porin OprF or OmpA produces LARGE channels, yet allow only SLOW permeation.



Only a portion of OmpA population produces stable, open channels

Sugawara & Nikaido, J. Biol. Chem. (1994)

Only a small portion of OprF/OmpA folds as a one-domain, open-channel conformer. The tendency to fold as an open-channel protein can be altered by point mutations in the protein.

Sugawara, Kojima & Nikaido, FEBS J 2012

Because the NonSpecific Porin OprF is so inefficient, drugs that are unusually active against *P. aeruginosa* often traverse OM through SPECIFIC channels.

A Classical Example is IMIPENEM, which diffuses through OprD, a basic AA channel



The crystal structure of OprD (OccD1) shows that Arginine binds to the specific binding site (Y176, Y282, D307)



Trias & Nikaido, AAC 1990 Trias & Nikaido, J. Biol. Chem. 1990

Eren et al. J. Biol. Chem. 2013

#### OM Diffusion of Large, Hydrophobic Compounds

These compounds are likely to traverse OM mostly through its asymmetric bilayer region, as suggested by the vastly increased susceptibility of deep rough and lpx LPS mutants (Vaara, AAC 1993).





Normal OM Bilayer, an Effective Barrier



Deep Rough OM Bilayer, an Ineffective Barrier

#### The models show that they are indeed too large for OmpF channel.





How can we estimate the rate of their diffusion through OM bilayer? First, calculate the fraction of uncharged species.

With compounds with potential multiple charges, the usual (macroscopic) pKa values may give misleading numbers here.

For example, with tetracycline, use of these values predict that only 0.0001 % is in the uncharged form at pH 7.4. In contrast, use of the proper MICROSCOPIC pKa values shows that 7.1 % is uncharged. (Nikaido & Thanassi, AAC 1993). Unfortunately, programs that calculates microscopic constants (Marvin, SPARC) produce wrong results.

#### Effect of Hydrophobicity in Drug Permeation Across Conventional Lipid Bilayer Membranes

Old study of Collander (1949), using *Chara* (algal) cells, showed that permeation rate across membrane bilayer is proportional to the partition coefficient, if correction for size is made.



The correlation was quite poor in a study with Caco cells, with ~40 drugs (Yazdanian et al. Pharmaceut. Res. 1998)



(A better fit can be obtained by using six (!) parameters (Kurkarni, Han, & Hopfinger 2002))

# The permeability again seems to reach a maximum When logD>0.

PC\*VMW seems to reach a maximum around 10 (cm/hr) or 30,000 (nm/s)

# Plésiat and Nikaido (Mol Microbiol 1992) found that diffusion across the asymmetric bilayer of OM was about 60 times slower than across the usual phospholipid bilayer.

We used steroids, with clogP between 2 and 3.5. For these compounds, Collander's data show that PC\*VMW across the conventional phospholipid bilayer membrane reaches  $3 \times 10^4$ . Since this study was done at 20°C, we estimate that at 37°C this will increase to about  $10^5$ , thus log PC to around 3.8. Across the OM, logPC was about 2, which corresponds to 60-times reduction from the phospholipid permeability.



So, for large, hydrophobic compounds with clogP >0, one would predict log (PC\*VMW) of 2.7. For erythromycin and rifampin (taking into account the fraction of uncharged species), permeability coefficients of 2 and 7 nm/s, respectively, are calculated. This is not negligible and comparable to the permeability of hydrophobic lactams, such as penicillin (10 nm/s). But this is much slower than the zwitterionic cephalosporins (around 1,000 nm/s) or the rapidly diffusing monoanionic cephalosporins (around 300 nm/s). This also explains why deletion of AcrAB-ToIC efflux pump makes *E. coli* susceptible to these drugs.

#### Can We Design Agents That Are Not Pumped Out by RND Pumps?

We have measured the efflux parameters of β-lactams via AcrAB-TolC pump (Nagano & Nikaido, PNAS 2009; Lim & Nikaido AAC 2010).



As seen, compared with a reasonable substrate Cefamandole, the very hydrophilic Cefazolin shows no evidence for efflux.

Also in the docking/MD simulation studies (Vargiu et al., PNAS 2012), completely hydrophilic compounds such as kanamycin and glucose showed no evidence for binding to AcrB.

# Session 1: Barriers to compound penetration and efflux avoidance

# Observations and Comments from a SBDD Perspective John Finn

- The Trius TriBE program focus was to design in Gram-negative activity by using the concepts of Silver and Nikaido
  - Dual-targeting
    - GyrB/ParE
  - Fluoroquinolone-like compounds
    - Highly potent, small molecular weight (high ligand efficiency)
    - Charged molecules (especially diamines)
- The TriBE program progress was made with many small steps
  - Compounds were built almost an atom at a time
  - Many iterations of SBDD
  - Avoid the traps of bias towards what you have

# "Benefits of multi-targeting" Lynn Silver Nat. Reviews Drug Dis. 2007, 6, 41



## Potential Paths to Enter a Gram-negative

- Front Door
  - Porins
  - It works for fluoroquinolones and tetracyclines
- Back Door
  - Active uptake via a Trojan Horse strategy
  - Fear of resistance
- Bust open a new door
  - Self promoted uptake like the aminoglycosides
  - Fear of toxicity



#### GyrB/ParE Active Sites Include Polar Binding Sites GyrB-Adenine Binding Pocket



#### **Key Features**

- Highly conserved: spectrum and dual targeting
- Unique pocket: selectivity
- Deep pockets: potency
- Balance of interactions: Antibacterial spectrum /drug properties

Binding Site includes polar residues that have not been extensively exploited in drug discovery to increase solubility / explore charged molecules

#### TriBE Discovery and Optimization

High potency, dual-targeting, broad-spectrum, plus drug properties





Sitafloxacin



- Total of 7 Hydrogen bonds
  - 3 to protein, 4 to water network

# TriBE compounds have similar properties to fluoroquinolones



### Issue 1: Confirm single MOA Off target activity is common!



# Issue 2: Potency Are your compounds smarter than Cipro?

P. aeruginosa efflux pumps SAR





	Cipro	GP-2	7
PAO397 <i>P. aeruginosa</i> five pump deletion strain	MIC 0.008 μg/mL	MIC 0.03 μg/mL	MIC 0.06 µg/mL
PAO1 <i>P. aeruginosa</i> wild type strain	MIC 0.13 µg/mL	MIC 1 µg/mL	MIC 32 µg/mL
Fold change	16x	32x	512x

### Unanswered Questions

- Can the activity be improved by better compound properties?
  - Better entry / better pump avoidance
- Almost an ideal case where many modifications can be made in solvent accessible region thereby retaining the enzymatic potency
  - We seemed to reach a peak level of activity that is hard to beat but easy to lose
  - But activity is always better on the imp strain
  - Focus is more on better PK, properties (e.g. solubility, protein binding) and safety
- It would be useful to measure porin entry and understand efflux SAR

## Antibacterial profile of an early lead

Antibacterial Potency MIC (µg/mL)	
E. coli (wt)	4
E. coli + serum*	2
E. coli (∆tolC)**	0.5
E. coli (imp)***	1
K. pneumoniae MDRª	32
K. pneumoniae WT	<0.5

Serum\* = 20% mouse serum  $\Delta$ tolC\*\* = pump knock-out Imp\*\*\* = permeability mutant *K. pneumoniae* strains used :MDR ATCC 700603 WT ATCC 10031

#### Recommendations/Make Antibacterial Drugs Great Again!

- Improved microbiological tools
  - Isogenic strains of pump knockouts for: A. baumannii and K. pneumoniae
  - Porin permeability assays: P. aeruginosa, A. baumannii and K. pneumoniae
- Mechanism of action assay service to make the technology more widely used
  - Macromolecular synthesis
- Focus (exclusively) on SBDD approaches
  - Screening is very low probability (the potency issue!)
  - Creating an antibacterial screening library is predicted to be a waste of resources
    - Money is better spent on supporting independent projects with good rationales
- Narrow focus of Gram-negative of projects to those with realistic chance
  - Must answer the question of potency compared to fluoroquinolones
  - Clear plan to achieve activity on targets located in the cytoplasm
    - Strong rationale to build compound properties compatible with G- activity
  - Shift focus to targets that are located in the periplasm or outer membrane

# **Kinetic Modeling of Gram-Negative Permeability**

Wright Nichols Consultant Microbiologist Cambridge, MA

February 6 2017

NIAID & The Pew Charitable Trusts: Challenges in the Discovery of Gram-negative antibacterials: the entry & efflux problem. Feb 6-7 2017, Rockville, MD

### **Three Interesting Questions**

- 1. How can I know whether my new compound penetrates to the cytoplasm, irrespective of growth inhibition?
- 2. What's more important: outer or cytoplasmic membrane permeability?
- **3.** What's more important: diffusion in or pumping out?

### A Minimum (Envelope) Permeability Coefficient

When growth just balances influx: a cell envelope permeability coefficient >10<sup>-8</sup> cm.s<sup>-1</sup> approx. indicates that the compound can passively reach the cytoplasm at a reasonable rate

#### **Examples of Lipid Bilayer Permeability Coefficients**<sup>1</sup>

Solute	<i>P</i> (cm.s⁻¹)	Gm-ve $(c_{\text{cyt}}/c_{\text{ext}})_{t \to \infty}$
2'-deoxyadenosine	9.40 × 10 <sup>-7</sup>	0.996
erythromycin	2.12 × 10 <sup>-8</sup>	0.838
tryptophan, pH 6.0	4.10 × 10 <sup>-10</sup>	0.0912
Na <sup>+</sup>	1.20 × 10 <sup>-14</sup>	2.94 × 10 <sup>-6</sup>

<sup>1</sup>For sources see: Nichols WW. 2012. Permeability of Bacteria to Antibacterial Agents. In Antibiotic Drug Discovery and Development Volume II (T.J. Dougherty & M.J. Pucci, eds). Springer Publishing Company. pp 849–879. Nichols WW. 2016. Modeling the kinetics of the permeation of antibacterial agents into growing bacteria and its interplay with efflux. Submitted.

61

#### **Permeability of Two Layers**

62



$$P = 0.99 \times 10^{-8}$$

# If the layers differ widely in permeability, the overall coefficient is slightly lower than the lowest coefficient of the contributing layers

Brodin et al. 2012. Passive diffusion of drug substances: the concepts of flux and permeability. In: Steffansen et al (eds.) Molecular Biopharmaceutics. Pharmaceutical Press, London (2010). pp 135-152.
Nichols WW. 2016. Modeling the kinetics of the permeation of antibacterial agents into growing bacteria and its interplay with efflux. Submitted.

## Influx Balanced against Efflux Inferences from kinetic analysis

The efflux coefficient acts reciprocally against the permeability coefficient for the membrane containing the efflux pump



Multiple efflux pumps in one membrane: additive kinetics

# Cytoplasmic and outer membrane pumps: *additive and multiplicative kinetics*

63

Nichols WW. 2012. Permeability of Bacteria to Antibacterial Agents. In Antibiotic Drug Discovery and Development Volume II (T.J. Dougherty & M.J. Pucci, eds). Springer Publishing Company. pp 849–879.
Palmer M. 2003. Efflux of cytoplasmically acting antibiotics from Gram-negative bacteria: periplasmic substrate capture by multicomponent efflux pumps inferred from their cooperative action with single-component transporters. J Bacteriol 185:5287–5289.

Nichols WW. 2016. Modeling the kinetics of the permeation of antibacterial agents into growing bacteria and its interplay with efflux. Submitted.

## **Conclusions from Kinetic Modeling**

- [Ignoring efflux] The cytoplasmic concentration of a solute in a bacterial cell should reach that of the external medium in a reasonably short time if its envelope permeability coefficient is higher than ~10<sup>-8</sup> cm.s<sup>-1</sup>
- The permeability coefficient must be >10<sup>-8</sup> cm.s<sup>-1</sup> for both the outer and cytoplasmic membranes
  - a lower value for either one would be limiting
- Pump arrangements
  - for two pumps in one membrane, efflux pump efficiencies add together
  - Gram-negative envelope: when there is an efflux pump in each membrane, their efficiencies both add and multiply

#### Influx and Efflux of Drugs Across IM

Hiroshi Nikaido

University of California, Berkeley

Influx into Bacterial Cytosol is Usually Quite Fast

Example: Tetracycline

7.1% of the drug is in uncharged form, on the basis of microscopic pKa values (Nikaido and Thanassi, 1993).

Since its clogP is -2.46 (i.e. P=0.0035), Collander data says PC\*VMW should be around 0.35, or the PC 0.017. However, the unit of PC in Collander is cm/hr. So, it will be around 50 nm/s or  $0.5 \times 10^{-5}$  cm/s. Because only 7% of the drug is in uncharged form, the actual PC should be ~  $3.5 \times 10^{-7}$  cm/s.

Because the half-equilibration time,  $t_{1/2}$  (in second) is

 $t_{1/2} = \ln 2^* (V/A)^* (1/PC)$ 

in *E. coli* cells (V=0.004 cm<sup>3</sup>/mg, A=132 cm<sup>2</sup>/mg) it will be around 1 min.

In contrast, in animal cells, e.g. hepatocytes, the term (V/A) will be nearly four orders of magnitude larger, and the permeation of drugs such as this becomes a very slow process, unless it is facilitated by carriers.

#### E. coli IM is full of "singlet" Efflux Pumps

These pumps are presumably important in exporting drugs into periplasm so that they can be exported out of the cell by RND tripartite efflux machinery, such as AcrAB-TolC.

Their significance can be seen in the extremely sensitive assay data of Nichols et al. Phenotyic Landscape of A Bacterial Cell, Cell 143: 1097 (2010), which can be accessed and analyzed at ecoliwiki.net/tools/chemgen. Among about 15 MFS pumps suspected of function in drug efflux, deletion of Bcr, YcaE, YdhC, YfcJ, YgsS, YidY (MdtL), or YjiO (MdtM) was found to increase the susceptibility of *E. coli* to tetracycline at least at one of the four concentrations used (0.25, 0.5, 0.75, and 1.0  $\mu$ g/ml). (SMR family pumps are only involved in the efflux of cationic substrates, so not relevant here). Interestingly, Nishino's 2001 paper using  $\Delta acrAB$  strain overexpressing many of these MFS pumps found no increased resistance to tetracycline, except Bcr and MdfA. How Do We Measure the Efflux Parameters of Singlet Pumps?

- 1. For precise determination of kinetic parameters, measurement of periplasmic drug concentration is essential. Develop a sensor protein (similar to TetR, used in cytosol by A. Sigler et al. (Eur. J. Biochem. 2000)) but expressed in periplasm?
- 2. If time-curves of drug accumulation can be obtained in *ΔacrAB* cells expressing only one relevant singlet pump, numerical solution of the differential equations?
- In ∆acrAB cells expressing only one singlet pump, its activity may be measured

   (a) by increases in oxygen consumption (detected e. g. by Seahorse bioanalyzer), or
   (b) by direct assay of the proton flux (detected by pH meter under anaerobic conditions, a la I. C. West (1970)).
- 4. More effort is needed in this direction.

LC-MS detection of drugs (Zhou et al., Anal Chem 2015; Davis et al. ACS Chem Biol 2014)?

Use of microfluidics to overcome the problems of fast kinetics?

## Session 1: Barriers to compound penetration and efflux avoidance

Lynn Silver, PhD LL Silver Consulting, LLC







- Since the major permeability difference between GN and GP the OM...
- And OM-permeable and efflux $\Delta$  GNs are sensitive to many GP drugs
- Some assume finding ways of crossing the OM and avoiding efflux will allow GN entry
- But novel compounds (such as cytoplasmic enzyme inhibitors) need qualities that also permeate the CM.

# **GN** barriers



- OM excludes hydrophobic and hydrophilic compounds.
- Penetration of hydrophilic compounds through OM is via:
  - general porins [<600 MW, prefer hydrophilic, charged]</p>
  - facilitated diffusion of specific hydrophilic solutes [OprD, Tsx]
- But hydrophilic and highly charged molecules entering the periplasm
  - penetrate the CM slowly or not at all
  - unless actively transported [or via PMF]
- Molecules that do enter can be effluxed
- What molecules can accumulate in the GN cytoplasm?


- Diffusion (no transporters)
  - Hydrophilic molecules: Cross OM rapidly via porins, may avoid efflux –poor CM passage
  - Lipophilic molecules: Cross OM slowly, can be effluxed good CM passage
- Active transport
  - Hydrophilic molecules cross OM via porins, CM via transporters [ATP or PMF driven]
- Self-promoted uptake [SPU] through OM
  - Cationic molecules, avoid efflux; CM passage via  $\Delta \psi$  or polycations may disrupt CM
- Trojan horse
  - Piggyback on active or facilitated transport; must avoid rapid resistance
- [• OM permeabilizers and EPIs as adjuncts ]
  - Combine with CM-transiting molecules [properties of GP drugs]

Session 2: Case studies: Finding ways to overcome barriers to compound penetration and efflux avoidance

## ACHAOGEN

Achaogen Approach to Understanding Permeability

#### Frederick Cohen On behalf of the Research Team

Portions of the research reported in this publication was supported by the National Institute Of Allergy And Infectious Diseases of the National Institutes of Health under Award Number R21AI113572. The content is solely the responsibility of the authors and does not necessarily represent the official views of the National Institutes of Health

### Acknowledgements

- Chemistry
  - Timothy Kane
  - Paola Dozzo
  - Darin Hildebrandt
  - Martin Linsell
  - Tim Machajewski
  - Glenn McEnroe
- Analytical Chemistry
  - Ken Wlasichuk
  - Mike Tang
- Biochemistry/Mol Bio
  - Logan Andrews

- Microbiology
  - Ryan Cirz
  - Cat Haglund
  - Hoan Le
  - Alisa Serio
- Computational Chemistry
  - Erin Bradley
- NIAID R21AI113572





### **Project Strategy for AccC**



A	1	

	MIC
Strain	(µg/mL)
E. coli	32
E. Coli ∆tolC	1
K. pneumoniae	64
A. baumannii	128
P. aeruginosa	>256
S. aureus	256
pKa	3.2
mwt	395
cLogD	3.5
charge (pH 7.4)	0



- Gram(–) barriers are preventing entry
  - Hypothesized that this was due to poor physiochemical properties
- Strategy: Use structure- and property-based design to discover new inhibitors optimized for Gram(–) entry while maintaining target potency
- Chance to *prospectively* apply property rules
  - Primarily focused on adding charge and reducing LogD



#### **Amine Substitution Improves Cellular Entry**

		H N <sup>*</sup> A805	HO A008	H <sub>2</sub> N A993	H <sub>2</sub> N A981
MIC, (µg/mL)	<i>E. coli</i> KD65 <i>E. coli</i> KD65 (∆ <i>tolC)</i> (shift) <i>E. coli</i> KD65 +PMBN (shift)	64 0.5 (128) 1 (64)	32 0.25 (128) 2 (64)	16 0.5 (32) 4 (4)	2 0.25 (8) 0.25 (8)
	PaAccC IC <sub>50</sub> (nM)	320	140	64	33
	cpKa	3.3	5.0	10.5	8.1
	mwt	307	390	389	387
	cLogD (pH 7.4)	2.8	3.5	-0.1	2.7
	Charge (pH 7.4)	0	0	1	1
	MIC <sub>(WT E. coli):</sub> IC <sub>50</sub> ratio	660	580	900	300

Best amine has only an 8-fold shift due to efflux or the outer membrane;

Tuning pKa is also important.

#### ACHAOGEN

#### **Combining Modifications on Both Vectors**

		$\begin{array}{c} & & \\$	A000		ARRE
H <sub>2</sub> N		A003	A330	A001	A000
$\widehat{}$	E. coli KD65	64	2	1	0.5
hg/mL	<i>E. coli</i> KD65 (∆ <i>tolC)</i> (Fold)	0.5 (128)	0.063 (32)	0.016 (64)	0.008 (64)
AIC, (	<i>E. coli</i> KD65 +PMBN (Fold)	1 (64)	0.25 (8)	0.06 (16)	0.03 (16)
2	P. aeruginosa $(\Delta mex)^1$	16	1	2	1
	PaAccC IC <sub>50</sub> (nM)	320	≤15	≤15	≤ 15
	cpKa	3.2	8.1	8.1	8.1
mwt cLogD (рН 7.4)		395	430	478	450
		3.5	2.5	3.0	3.6
	Charge (pH 7.4)	0	1	1	1

<sup>1</sup>The *P. aeruginosa* APAE006 strain contains targeted knockouts of efflux pumps MexAB-OprM, MexCD-OprJ, and MexEF-OprN, and the efflux pump components MexXY are expected to be compromised by the absence of OprM.

### A886 has MIC90s (n=20) of 1 and 4 mg/mL against clinical isolates of *E. coli* and *KPN*

#### **Efficiency Data for LpxC Inhibitors**



-MIC = geomean of MIC against 5 clinical isolates of *P. aeruginosa*;

 $-IC_{50} = Inhibitory$  concentration against LpxC from *P. aeruginosa*.

-For this series of inhibitors against *P. aeruginosa*, molecular 'size' is the best predictor of overall permeability -Instead of binning compounds by 'compartment of action' analyze how well compounds reach site ACHAOGEN

### **Achaogen Approach to Optimizing Permeability**

- Use matched pairs of strains and conditions to assess the contribution of each barrier
  - *E. coli* wt; *E. coli*  $\Delta$ *tolC* or  $\Delta$ *acrAB*;  $\pm$  PMBN
  - *P.aeruginosa* wt or  $\Delta mex \pm PMBN$
  - Requires large MIC panels, typically 15–20 strains/conditions for a primary panel
- Generate on-target potency for assessment of overall permeability
  - Requires robust biochemistry
- Don't be afraid to make inactive molecules to test specific hypotheses
- Drivers of permeability are likely to specific to each strain/chemical scaffold combination
- Biotin carboxylase program deprioritized due to large mutation liability in *P. aeruginosa*. This will likely be the case for any Single-Target:

1 gene  $\rightarrow$ 1 protein — inhibitor

• This could be the subject of another workshop.

Erin Duffy



### De novo Design of the Pyrrolocytosines: Exploring the Role of Efflux in Driving Broad-Spectrum Activity



Panels used in this study:

1705xxx are clinical isolates, collected in the US between 2005-2007, by Eurofins

P. aeruginosa panel courtesy of Professor Herbert Schweizer

Essential to our strategy is the ability to explore chemistry in target "open space" to drive Gram-negative activity





lelinta

HERAPEUTICS



### Each exploration delivered some promise for Gram-negative coverage, but efflux limits broad-spectrum potential

bsc



Bacterial Strain	Phenotype	RX-P2	P106	P569	RX-P542
E. faecium A6349	VanA, Lin-R (G2576U)	128	16	4	4
S. aureus 11540	MRSA (USA300)	16	2	<0.25	0.5
E. coli 1705863		>128	2	2	2
E. coli 1705878	ESBL, MDR	>128	2	2	1
K. pneumoniae1705966		>128	4	<0.25	<0.25
K. pneumoniae1705949	KPC, MDR	>128	4	4	8
P. aeruginosa1705886		>128	>128	64	32
P. aeruginosa1705904	MDR	>128	>128	>128	64
A. baumannii 1705943		>128	2	0.5	0.5
A. baumannii 1705936	MDR	>128	>128	128	64
	"Efflu	IX"			
P. aeruginosaPAO1	parent	>128	>128	64	64
P. aeruginosaPAO750	$\Delta$ (mexAB-oprM) $\Delta$ (mexCD-oprJ) $\Delta$ (mexEF-oprN) $\Delta$ (mexJKL) $\Delta$ (mexXY) OpmH+ $\Delta$ -opmH362 $\Delta$ -	>128	4	<0.25	<0.25

## A computational, clustering approach to finding chemistries that influence efflux





## Exemplars from two clusters suggest efflux can be minimized

		x	X	X	X	X	×	X	X	X	×	Щ <sub>х</sub>
Bacterial Strain	Phenotype	P542	P658	P606	P708	P741	P762	P696	P689	P756	P715	P605
<i>E. faecium</i> A6349	VanA, Lin-R (G2576U)	4	4	4	1	2	4	2	4	4	8	4
S. aureus 11540	MRSA (USA300)	0.5	1	2	1	2	0.5	2	2	0.5	0.5	1
<i>E. coli</i> 1705878	ESBL, MDR	1	8	16	16	64	32	32	128	32	8	1
K. pneumoniae 1705949	KPC, MDR	<0.25	4	64	64	128	>128	64	128	128	1	1
P. aeruginosa 1705904	MDR	64	>128	>128	64	>128	>128	>128	>128	>128	32	16
<i>A. baumannii</i> 1705936	MDR	64	>128	>128	64	>128	64	64	>128	>128	32	16
				1	'Efflux"							
P. aeruginosa PAO1	parent	64	>128	>128	64	>128	128	64	>128	>128	16	8
<i>P. aeruginosa</i> PAO750	Δ(mexA-oprM) Δ(mexCD-oprJ) Δ(mexEF-oprN) Δ(mexJKL) Δ(mexXY) OpmH+ Δ-opmH362 Δ-psc	<0.25	1	4	<0.25	2	0.5	2	1	1	1	0.25

**N**elinta<sup>®</sup>

## Making neighbors in those clusters delivers compounds with broad-spectrum activity







	-		
Bacterial Strain	Phenotype	RX-P542	RX-P792
E. faecium A6349	VanA, Lin-R (G2576U)	4	0.5
<i>S. aureus</i> 11540	MRSA (USA300)	0.5	≤0.25
<i>E. coli</i> 1705863		2	≤0.25
E. coli 1705878	ESBL, MDR	1	0.5
K. pneumoniae 1705966		8	≤0.25
K. pneumoniae 1705949	KPC, MDR	<0.25	≤0.25
P. aeruginosa 1705886		32	2
P. aeruginosa 1705904	MDR	64	4
A. baumannii 1705943		0.5	≤0.25
<i>A. baumannii</i> 1705936	MDR	64	2
	"Efflux"		
P. aeruginosa PAO1	parent	64	2
P. aeruginosa PAO750	Δ(mexA-oprM) Δ(mexCD-oprJ) Δ(mexEF-oprN) Δ(mexJKL) Δ(mexXY) OpmH+ Δ-opmH362 Δ-psc	<0.25	0.25

### A reasonable correlation can be drawn with three molecular properties



Dipole moment, acceptor hydrogen bonds and total aromatic solvent-accessible surface area

### Reducing the gap between parent and efflux-deficient strains correlates with activity against MDR strains



	ΔΜΙC										
128										1	1
64									1	4	4
32						1	1	1	4		
16			1	1	1	4	4	5	4	3	4
8	4	5	5	5	8	4	4	3		1	
4	5	4	3	3							
2											
1											
0											

Strain	Description
PAO200	Δ(mexAB-oprM)
PAO238	Δ(mexAB-oprM)Δ(mexCD-oprJ)
PAO255	Δ(mexAB-oprM) Δ(mexEF-oprN)
PAO280	Δ(mexAB-oprM) Δ(mexXY)
PAO314	Δ(mexAB-oprM) Δ(mexCD-oprJ)Δ(mexJKL)
PAO325	Δ(mexAB-oprM) Δ(mexCD-oprJ) Δ(mexJKL) Δ(mexXY)
PAO397	Δ(mexAB-oprM) Δ(mexCD-oprJ) Δ(mexEF-oprN) Δ(mexJKL) Δ(mexXY) ΔopmH
PAO509	Δ(mexAB-oprM) Δ(mexCD-oprJ)Δ(mexEF-oprN)Δ(mexJK)Δ(mexXY)
PAO1095	Δ(mexAB-oprM) Δ(mexCD-oprJ) Δ(mexEF-oprN) Δ(mexJK) Δ(mexXY) Δ(triABC)

ΔMIC is from parent (PAO1); panel is from H. Schweizer

**THERAPEUTICS** 

#### This leads to a characteristic, "flat" pattern of



#### activity across resistant Pseudomonads

Strain (MICs in µg/mL)	Ciprofloxacin	Tobramycin	Tigecycline	Pip/Tazo	Cefepime	Ertapenem	Colistin	RX-P792
P. aeruginosa 1705886	0.125	0.5	8	8	2	16	2	2
P. aeruginosa 1705888	0.125	0.5	8	128	32	128	1	2
P. aeruginosa 1705911	0.125	0.5	8	128	16	32	1	2
P. aeruginosa 1705890	0.25	0.5	8	128	64	16	2	2
P. aeruginosa 1705896	0.25	0.5	8	4	4	16	8	4
P. aeruginosa 1705906	16	0.5	8	128	32	128	1	2
P. aeruginosa 1705898	32	0.5	32	128	32	128	2	4
P. aeruginosa 1705899	64	0.5	16	128	16	8	1	4
P. aeruginosa 1705907	0.125	1	16	16	2	4	1	4
P. aeruginosa 1705909	0.125	1	16	1	8	0.25	1	2
P. aeruginosa 1705892	0.25	1	16	128	16	128	1	4
P. aeruginosa 1705893	0.25	1	16	64	16	128	2	4
P. aeruginosa 1705908	0.25	1	16	8	8	2	1	4
P. aeruginosa 1705913	0.25	1	16	8	4	16	1	4
P. aeruginosa 1705891	0.5	1	8	128	32	32	1	4
P. aeruginosa 1705915	0.5	1	32	1	16	0.25	0.5	4
P. aeruginosa 1705889	2	1	8	128	16	64	1	4
P. aeruginosa 1705902	32	1	16	128	32	32	2	4
P. aeruginosa 1705895	32	2	32	32	16	128	1	4
P. aeruginosa 1705903	32	2	16	128	64	32	1	4
P. aeruginosa 1705897	64	2	32	128	64	128	1	4
P. aeruginosa 1705887	1	4	32	128	32	128	0.5	4
P. aeruginosa 1705912	32	8	2	128	32	64	1	1
P. aeruginosa 1705900	64	16	4	128	32	128	1	1
P. aeruginosa 1705901	16	128	16	128	128	128	2	4
P. aeruginosa 1705905	32	128	32	128	64	128	8	4
P. aeruginosa 1705910	32	128	16	128	128	128	1	4
P. aeruginosa 1705904	128	128	32	128	128	128	8	4

### Session 3: Enabling technologies to measure compound permeability and accumulation

### The Holy Grail of Compound Uptake Assays would be:

- Robust (sensitive, reproducible)
- Involve direct detection of compounds (w/o need for pre-labelling)
- Kinetic
- Quantitative
- Whole cell-based, including relevant strains
- Capable of informing sub-cellular localization
- High throughput
- Cost-effective

### **Traditional methods & their limitations**

### Direct detection

### - Radiometry, Fluorometry, Spectroscopy

- Usually low throughput\*
- challenges associated with non-specific binding or other assaydependent influence on results
- specific compound localization undefined

### Indirect detection

- Electrophysiology, Liposome swelling
  - low throughput, technically challenging
- Differential MICs of engineered strains
  - Relies on inherent antibacterial activity which may differ due to differences in target potency, metabolism, other parameters of compounds under study



### Bacterial membrane permeation: By the masses for the masses



Kyu Rhee MD PhD

Department of Medicine and Microbiology & Immunology

10.20.16



### Drug Activity = PK + PD



### SAR = $\delta$ (PK + PD)



### **Penetration** Inhibition



### **PK =** *target exposure* + target binding

## Target exp [(penetration –efflux) +/-(\*)

\*(activation/retention/degradat

### Technologic platform: Sensitive, unbiased, multiplex profiling



Expose Quench Recover Analyze

# MIC assay and biocalibration curves



Dose exposure = concentration x time





### MS-based mass balance analysis

#### **Advantages**

- Sensitive
- High throughput
- Native analysis
  - Compound
  - Biological barrier
- Molecular resolution
- Linked MOA profile

#### Disadvantages

- Ionizability
- Endpoint measurements
- Relative quantitation
  - Otherwise requires time-intensive standardization


## Toward a General Platform for Structureand Activity-Independent Quantitation of Small-Molecule Permeability in Bacteria

### Derek S. Tan



Chemical Biology Program Memorial Sloan Kettering Cancer Center and Tri-Institutional Research Program New York, New York

#### **Bacterial Permeability of Small Molecules**

Permeability is poorly understood and a major obstacle to rational antibiotic discovery

• Principal component analysis of 21 structural and physicochemical properties

	Parameter	Description	Source	
ydrogen ding	MW	molecular weight	Instant JChem	
	SA	surface area	Instant JChem	
	N	number of nitrogens	Instant JChem	
H U	0	number of oxygens	Instant JChem	
Size 8 B	HBD	number of hydrogen bond donors	Instant JChem	
	HBA	number of hydrogen bond acceptors	Instant JChem	
Hydrophobicity & Polarity	LogD	calc <i>n</i> -octanol/water partition coefficient (pH 7.4)	Instant JChem	
	LogP	calc <i>n</i> -octanol/water partition coefficient	Instant JChem	
	ALogPs	calc <i>n</i> -octanol/water partition coefficient (Tetko)	http://www.vcclab.org	
	ALogpS	calc aqueous solubility (Tetko)	http://www.vcclab.org	
	tPSA	topological polar surface area	Instant JChem	
	reIPSA	tPSA ÷ SA	Instant JChem	

	Parameter	Description	Source	
3D Structure	nStereo	number of chiral atoms	Instant JChem	
	nStMW	nStereo ÷ MW (stereochemical density)	Instant JChem	
	Fsp3	number of sp3 carbons + number of carbons	Instant JChem	
	RotB	# rotatable bonds	Instant JChem	
Ring Content	Rings	number of rings	Instant JChem	
	RngAr	number of aromatic rings	Instant JChem	
	RngLg	number of atoms in largest ring	Instant JChem	
	RngSys	number of ring systems	Instant JChem	
	RRSys	Rings ÷ RngSys (ring complexity)	Instant JChem	



#### Antibiotics have distinct structural and physicochemical properties compared to non-antiinfectives

- Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." ACS Chem. Biol. **2014**, *9*, 2535–2544
- Review: Lewis, K. "Platforms for antibiotic discovery." Nat. Rev. Drug Discov. 2013, 12, 371–387.

#### **LC-MS/MS** Analysis of Compound Accumulation in Bacteria

Structure & activity-independent quantitation of permeability of diverse molecules



• Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." *ACS Chem. Biol.* **2014**, *9*, 2535–2544.

• LC-MS/MS quantitation: Cai, H.; Rose, K.; Liang, L. H.; Dunham, S.; Stover, C. Anal. Biochem. 2009, 385, 321-325.

#### Permeability of a Panel of Diverse Acyl-AMS Congeners

LogP alone is insufficient to explain observed permeability trends



• Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." *ACS Chem. Biol.* **2014**, *9*, 2535–2544.

rich media

#### **Cheminformatic Analysis of Permeability of Acyl-AMS Panel**

*Complex and non-obvious correlations between structure and permeability* 

HBA • 0 • HBD 0.25

▲ OSB(24)

0.50

0.50

-0.25

0.00

tPSA•

-0.25

-0.50

2

E. coli

• Principal Component Analysis:

visual indications of properties that correlate with permeability



Pearson pairwise • correlation coefficients: quantitative correlations between properties and permeability

	Parameter	E. coli	B. subtilis	M. smeg
ue	MW	0.46	0.55	0.16
00 0	SA	0.52	0.78	0.01
ding	N	-0.38	-0.34	-0.12
Η̈́́́́́	0	-0.26	0.01	-0.32
B	HBD	-0.33	-0.04	0.19
Si	HBA	-0.36	-0.05	-0.30
త	LogD	0.70	0.52	0.60
, cit	LogP	0.71	0.67	0.48
rit)	ALogPs	0.84	0.83	0.35
pho	ALogpS	-0.84	-0.76	-0.35
ър	tPSA	-0.56	-0.21	-0.43
Ę	relPSA	-0.76	-0.80	-0.27
е	nStereo	-0.24	-0.25	-0.36
tir D	nStMW	-0.43	-0.48	-0.34
3-	Fsp3	-0.27	0.31	-0.74
S	RotB	0.20	0.79	-0.41
	Rings	0.61	0.08	0.75
ng tent	RngAr	0.61	0.08	0.75
Rir	RngSys	0.61	0.08	0.75
S	RRSvs	-0.49	-0.02	-0.76

red = positive correlation **blue** = negative correlation **bold** = p < 0.05 (*t*-test)

• Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." ACS Chem. Biol. 2014, 9, 2535-2544.

#### **Testing Predictions Based on Cheminformatic Analysis**

Designed analogues accumulate to higher levels in E. coli as predicted



	sal-AMS (1)	salicyl- (2-phenyl-AMS)	salicyl- (2-phenylamino-AMS)
MW	466	543	558
SA	563	671	688
Ν	6	6	7
0	8	8	8
HBD	5	5	6
HBA	12	12	13
LogD	-1.43	0.75	0.69
LogP	-2.11	1.88	1.52
ALogPs	-0.44	1.58	1.81
ALogpS	-2.21	-3.06	-3.16
tPSA	212	212	224
reIPSA	38	32	33
nStereo	4	4	4
nStMW ‡	8.6	7.4	7.2
Fsp3	0.29	0.22	0.22
RotB	5	6	7
Rings	4	5	5
RngAr	3	4	4
RngLg	6	6	6
RngSys	3	4	4
RRSys	1.33	1.25	1.25



*E. coli*, 100  $\mu$ M salicyI-AMS 37 ° C, 30 min, LB

#### E. coli accumulation correlates with size, hydrophobicity, aromatic ring content

• Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." *ACS Chem. Biol.* **2014**, *9*, 2535–2544.

<sup>‡</sup> For clarity, values shown are [nStMW x 1000]

#### **Future Directions**

Increasing throughput, expanding strains, developing robust cheminformatic models



### n = 8 with removal of outliers (Grubbs'test)

6FABA

#### Near-Term Goals

- Evaluate 100-1,000 compounds in single chemotype
- Develop predictive cheminformatic models
- Assess robustness of models experimentally

#### Increasing Throughput

- evaluate other cell recovery protocols
- streamline incubation protocol
- multiplex compounds
- leverage automated instrumentation

#### Expanding Strains

- evaluate wt vs. pump knockout vs. permeability mutant strains
- evaluate approaches to differentiating subcellular compartments
- expand to other Gram-negative pathogens (e.g., P. aeruginosa)

#### Developing Robust Cheminformatic Models

- investigate machine learning approaches
- investigate non-linear modeling approaches
- identify motifs with idiosynchratic transport mechanisms

• Ji, C.; Sharma, I.; Pratihar, D.; Hudson, L. L.; Maura, D.; Guney, T.; Rahme, L. G.; Pesci, E. C.; Coleman, J. P.; Tan, D. S.\* *ACS Chem. Biol.* **2016**, *11*, 3061–3067.

#### **Acknowledgments**

#### www.dstan.org

#### Christopher Evans Jonghan Peter Lee Michaelyn Lux Lisa Standke Alyssa Verano

Renato Bauer, PhD Justin Cisar, PhD Tony Davis PhD Sirkka Moilanen, PhD Justin Potuzak, PhD Shiying Shang, PhD Christopher Stratton, PhD Jacqueline Wurst, PhD

#### **Kristin Hulsaver**





A partnership with the Sloan Kettering Institute



#### Dr. Maria Chiriac Dr. Corinne Foley Dr. Tezcan Guney Dr. Christina Rotsides Dr. Daniel Tao

- Dr. Joshua Brooks Pro Dr. Christine DiBlasi Pro Dr. Cheng Ji Dr. Dr. Felix Kopp Dr. Daniel Macks Prof. Gustavo Moura-Letts Dr. Debarshi Pratihar Dr. Hayato Iwadare Dr. Guodong Liu Dr. Xuequan Lu
- Prof. Jae-Sang Ryu Prof. Indrajeet Sharma Dr. Todd Wenderski

Prof. Luis Quadri (Brooklyn College) Prof. Peter Tonge (Stony Brook) Prof. William Bishai (Johns Hopkins) Prof. James Coleman (East Carolina) Prof. Everett Pesci (East Carolina) Prof. Laurence G. Rahme (MGH)

NIH (NIGMS, NIAID, NCI, NCRR) MSK Experimental Therapeutics Center MSK Geoffrey Beene Cancer Center MSK Lucille Castori Center Prof. Christopher Lima (MSKCC) Prof. Debopam Chakrabarti (U. Central Florida) Prof. James McKerrow (UCSD) Dr. Lisa Marcaurelle (Broad → Warp Drive) Dr. Sivaraman Dandapani (Broad → Biogen)

Dr. George Sukenick (MSK NMR/MS Core) Dr. Elisa de Stanchina (MSK Antitumor Assessment Core) Dr. J. Fraser Glickman (RU HTS Resource Center)

*Tri-Institutional Stem Cell Initiative Starr Cancer Consortium* 

#### LC-MS/MS Analysis of Compound Accumulation in Bacteria

Optimization and reproducibility of compound recovery protocol

• Four washes sufficient to remove extracellular compound (Fig. S18)

 Protocol has low day-to-day variability (Fig. S19)



• Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." *ACS Chem. Biol.* **2014**, *9*, 2535–2544.

#### **Cheminformatic Analysis of Efflux of Acyl-AMS Panel**

Larger analyses are required to identify robust correlations





		E. coli		B. subtilis		M. smegmatis	
	Parameter	сссР	PABN	сссь	reserpine	сссР	reserpine
en	MW	0.06	0.30	-0.05	0.42	-0.27	0.41
ខ្លុំត	SA	0.02	0.64	-0.15	0.44	-0.07	0.44
di <mark>V</mark> di	N	0.26	-0.13	-0.05	-0.04	-0.19	-0.15
H L C	0	0.24	-0.25	-0.23	-0.36	0.07	-0.20
С З С	HBD	0.32	-0.31	-0.01	-0.24	-0.33	-0.33
ŝ	HBA	0.15	-0.30	-0.20	-0.34	-0.12	-0.30
8	LogD	0.09	0.64	0.27	0.74	-0.29	0.48
, cit	LogP	-0.13	0.67	0.16	0.71	-0.20	0.59
rit pi	ALogP	-0.13	0.78	0.03	0.80	-0.21	0.64
ola bi	ALogS	0.18	-0.64	-0.02	-0.81	0.26	-0.68
알머	tPSA	0.21	-0.40	-0.31	-0.48	0.00	-0.40
Ť	relPSA	0.01	-0.77	-0.06	-0.67	0.12	-0.65
ø	nStereo	-0.30	-0.22	-0.19	-0.14	-0.27	-0.67
с ţ	nStMW	-0.27	-0.34	-0.11	-0.39	0.11	-0.62
<u>ч</u> 5	Fsp3	-0.04	0.57	-0.50	-0.32	0.64	-0.26
S	RotB	0.03	0.77	-0.39	0.05	0.43	0.27
	Rings	-0.06	-0.20	0.38	0.66	-0.69	0.48
b la	RingAr	-0.06	-0.20	0.38	0.66	-0.69	0.48
Rir	RngSys	-0.06	-0.20	0.38	0.66	-0.69	0.48
0	RRSys	0.02	0.27	-0.46	-0.51	0.66	-0.41

- Significant differences between bacterial strains
- E. coli CCCP:
- *E. coli* PAβN:
- B. subtilis CCCP:
- B. subtilis reserpine:
- *M. smegmatis* CCCP:
- *M. smegmatis* reserpine:

no statistically significant correlations

- + hydrophobicity, + rotatable bonds
- polarity
- + ring content
- + hydrophobicity, + ring content
- polarity
- ring content
- eserpine: + ring content, + hydrophobicity
  - polarity, 3D structure

• Davis, T. D.; Gerry, C. J.; Tan, D. S. "General platform for systematic quantitative evaluation of small-molecule permeability in bacteria." *ACS Chem. Biol.* **2014**, *9*, 2535–2544.



Helen Zgurskaya Department of Chemistry and Biochemistry University of Oklahoma

#### Kinetics of drug uptake is determined by assay conditions



Cold shock permeabilizes the OM; too complicated kinetics is often an artefact of experimental conditions

#### Hyperporination permeabilizes outer membranes of different species in controlled manner



The "Pore" is not selective and does not discriminate based on hydrophilicity, charge and mass up to 2000 Da

# High-density kinetic data are needed for mechanistic insights and modeling: continuous assays, including microfluidics



For most uptake data, either initial rates (slow kinetics) or steady-states (fast kinetics) could be extracted

#### Traditional filter (discontinuous) assays are sensitive to nonspecific binding and drug affinity to intracellular targets



There is no a washing protocol that generates the same S/N ratio for two different compounds. Additional complications arise from: 1) binding to plastic or glass surfaces (negative rates); 2) precipitation from solution during incubations (negative rates); 3) binding to LPS (high noise); 4) covalent complexes etc

## In the absence of a high-affinity target kinetics of uptake is usually fast



Ciprofloxacin











LC-MS can cover chemical diversity and high-throughput; but kinetic insight is limited; absolute concentrations could be misleading; relative changes in accumulation identify efflux- and OM- specific properties



DTRA/OU P. aeruginosa project:

- 134 Compounds analyzed for detection via LC-MS
- 38 Compounds could not be identified or quantified with the current LC-MS method
- 63 Compounds have been analyzed by LC-MS Kinetic Uptake Experiments
- 7 Compounds cannot be identified in samples with cells
- 44 Compounds have quantifiable data from Kinetic Uptake Experiments
- Four Pae strains (WT, WT-Pore, Delta Efflux, DeltaEfflux-Pore); four concentrations for each compound; two time points= 32 samples x 3 injections per sample= 96 injections per compound + calibration= ~120 injections per compound per experiment = 24 hrs of instrument time

Session 4: Establishing physicochemical guidelines for compound entry & efflux



## Challenges in the discovery of Gram-negative antibacterials

Heinz E. Moser NIBR, GDC Emeryville February 6, 2017 Rockville, MD



### **The Problem**

Historical attrition is well recognized among experts

- Drug discovery for intracellular targets in mammalian cells is not trivial
  - Requires optimization of multiple parameters in parallel
  - Remains similar for antibiotics
- Additional requirements for Gram-negative antibiotics
  - Additional membrane with fundamentally different architecture and permeability requirements (high polarity)
  - Evolutionary optimized efflux machinery with multiple players and high level of promiscuity
  - Resistance
  - Administration of high doses (safety)

#### The chemical space to fulfill these requirements is much more limited



### **Approaches to improve success**

Multiple parameters have to be addressed, no simple solution

- Identification of valuable chemical starting points
  - Diversify screening (phenotypic, target-based; implement new technologies and deviate from historical norm)
  - Focus on chemical matter which is expected to increase the chances for success (NPs, lower Mw, more polarity, less aromaticity)
  - Synthetic biology
  - Under-explored hit-finding approaches (e.g. FBDD, DELs)
  - Combine these approaches in smart ways
  - Focus on targets within periplasm (benefits for permeability & safety)
- Improve understanding on permeability and efflux
  - Experimental techniques to determine intracellular compound concentration irrespective of biological activity
  - Pragmatic approach for efflux; establish scaffold-dependent SAR



#### **Property Space of Drugs, Antibiotics, and Archives**

Unique property space for antibiotics, especially for Gram-negative bacteria



#### Property Space of Drugs, Antibiotics, and Archives (I)

Target 1, localization within cytoplasm



#### Property Space of Drugs, Antibiotics, and Archives (II)

Target 2, localization within cytoplasm



132 Property space in drug discovery / Heinz Moser, GDC EMV / UC Irvine, January 30, 2017

#### **Property Space of Benchmarking Fluoroquinolones**

Cipro-, Gati-, Levo-, Moxi-, Spar-, and Clinafloxacin (target within cytoplasm)



133 Property space in drug discovery / Heinz Moser, GDC EMV / UC Irvine, January 30, 2017

#### Property Space of Drugs, Antibiotics, and Archives (III)

Target 3, localization within periplasm



#### Property Space of Drugs, Antibiotics, and Archives (IV)

Target within cytoplasm; E. coli wt activity, all compounds



135 Property space in drug discovery / Heinz Moser, GDC EMV / UC Irvine, January 30, 2017

## Session 4: Establishing physicochemical guidelines for compound entry & efflux

Lynn Silver, PhD LL Silver Consulting, LLC





MW

## Binning by route of entry

- Require large numbers of compounds to establish "rules" for various routes of entry or efflux-avoidance
- Need diverse compounds that do and do not accumulate in the cytoplasm
- Need method, independent of activity, to measure accumulation of compounds in cytoplasm
- Measure accumulation in genetically defined strains (especially efflux deletions) and with permeability assays to "define" route of entry
- Iteratively derive hypotheses for rules/routes
- What compounds to test?

## CDD ModelBuilding





- Top 100 scores 14.3 to 4.62
- Top 100 include more lipophilic compounds than the training set



#### Compounds across scores

