FDA/M-CERSI, Best Scientific Practices Workshop; Latest Regulatory and Industry Perspectives Tue 29<sup>th</sup>–Thur 31<sup>st</sup> August 2023 University of Maryland; Shady Grove (Rockville, MD)

#### **Hot Topic H: Considerations for Model Application**

**VBE Trials** *vs* **Single Representative Modeling** 

# Dealing with Within- and Between-Subjects Variability (WSV & BSV) and Parameter Uncertainty

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# **Declaration of Conflict of Interest**

As the Director of CAPKR (Centre for Applied Pharmacokinetics Research my research is sponsored by a group of pharmaceutical companies (currently AbbVie, Amgen, Eli Lily, EMD Serono, Genentech, GSK, J&J, Roche, Servier, Takeda) in addition to grants from non-for-profit organizations, governments and research councils.

As the Chief Scientific Officer and SVP of R&D at Certara, I have been involved in overseeing the development of software tools by Certara Inc which are used by a large group of pharmaceutical companies during drug discovery and development; particularly in the area of physiologically-based pharmacokinetics (PBPK) and quantitative systems pharmacology (QSP) and toxicology (QST).

# Disclaimer

This presentation is prepared in my *personal capacity* as a scientist engaged with clinical pharmacology and pharmaceutical science for over 30 years. The opinions expressed herein are my own and do not reflect the views, policies, and strategies of any of the organisations I am affiliated with.





### Two formulations giving rise to

## essentially similar drug concentration-time profiles



- (1) Mostly R-T Cross-Over;
- (2) Parallel with larger number if wash-out is too long;
- (3) RTR and RTRT if WSV is too high

Proof of Concept in Assignment of Within-Subject Variability During Virtual Bioequivalence Studies: Propagation of Intra-Subject Variation in Gastrointestinal Physiology Using Physiologically Based Pharmacokinetic Modeling

Margareta Bego, Nikunjkumar Patel, Rodrigo Cristofoletti, Amin Rostami-Hodjegan AAPS J. 2022 Jan 5;24(1):21



An ESSENTIAL READ for Anyone Conducting **VBE** 

## **Evidence for Formulation-Dependent WSV**

Methyphenidate: Insight from RTRT Design

Comparison	Mean (ng $\times$ hr/ml)	Percent	Confidence limits Ln cmax
REF. 1, REF. 2	7.01, 6.70	96-105% <sup>a</sup>	84-119%
TEST 1, TEST 2	7.72, 7.45	97-104% <sup>b</sup>	76–131% 🖕
TEST 1, REF. 1	7.72, 7.01	110% <sup>c</sup>	103-123%
TEST 1, REF. 2	7.72, 6.70	115% <sup>c</sup>	84-117%
TEST 2, REF. 1	7.45, 7.01	106% <sup>c</sup>	106–138%
TEST 2, REF. 2	7.45, 6.70	111% <sup>c</sup>	93–123%
Mean TEST, REF.	7.58, 6.85	111% <sup>c</sup>	99–121% 🔶

- <sup>a</sup> (Ref. 1/Ref. 2) and (Ref. 2/Ref. 1).
- <sup>b</sup> (Test 1/Test 2) and (Test 2/Test 1).
- <sup>c</sup> (TEST/REF.).

## Meyer et al. 2000



- Faster Dissolution & Absorption of T vs R
- T vs T more variable than R vs R
- On Average T(1&2) vs
  R(1&2) → BE
- On Individual Trial Basis of T
  vs R → Not-BE

### **Misinterpreting the Effects of Formulation-Dependent WSV**



100

90

#### Swaminathan et al. 2013

### **Right & Wrong of Accounting for WSV when Conducting VBE**





Bego et al. 2022, AAPS J

## Availability of Measured WSV in Physiology in GI Tract: An Issue!

Table 2 Different sets of WSV in GI physiology investigated

Physiological Parameters - WSV CV%	Default	Set 1	Set 2	Set 3	Set 4	Set 5	Set 6	Set 7	Set 8	Set 9	Set 10	Set 11	Set 12	Set 13	Set 14
Gastric MRT(h)	38	19	19	19	25	30	25	25	30	25	19	38	38	38	19
Small Intestine MRT (h)	30	15	15	15	10	10	10	20	15	10	15	15	15	30	15
Colon MRT (h)	30	30	30	30	30	20	20	30	30	30	30	30	30	30	30
Duodenum pH Fasted	16	16	16	8	16	8	10	16	10	16	16	16	16	16	Dy
Duodenum Bile Salt Conc Fasted	97	97	49	97	70	97	70	49	49	49	49	97	97	97	49
Jejunum I pH Fasted	13	13	13	7	13	7	10	13	5	13	13	13	13	13	Dy
Jejunum I Bile Salt Conc Fasted	100	100	50	100	70	100	70	50	50	50	50	100	100	100	50
Jejunum II pH Fasted	11	11	11	6	11	6	10	11	5	11	11	11	11	11	Dy
Jejunum II Bile Salt Conc Fasted	42	42	21	42	30	30	30	21	21	21	21	21	42	21	21

CV% differing from the default (BSV) value are highlighted blue. CV% for volume of water administered was set to 1%, initial volume of stomach fluid at 30%, stomach pH at 38% and drug clearance to 5% in all sets except Set 10 (where CV% in CL was set to 0%). CVs for liver and brain volume and kidney weight were set to zero. Dy=dynamic (option in the Simcyp simulator)

### **Compatibility of Assigned WSV in Physiological Parameters** with Observed WSV of PK: A Potential Solution?



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### **IDENTIFIABILITY ISSUE:**

#### - **DISMISS IMPROBABLE SETS** ✓ of

WSV of Physiological Parameters of GI tract based on incompatibility with observed WSV of PK Parameters,

- NO UNIQUE SET of WSV × for GI tract if only a single drug/formulation is used,
- **OBTAIN COMMPN SET (?)** by applying the process to several drugs & varying formulations which are sensitive to different elements of GI tract WSV
- CCHECK AGAINST MEASURED
  WSV (?) of GI tract physiology when these are available.

**Observed vs Predicted Distributions** 

(AUC, C<sub>max</sub> and T<sub>max</sub>) (Kolmogorov-Smirnov Test)

SET	D statistic AUC	Similarity (Y/N)	D statistic Cmax	Similar ity Y/N)	D statistic Tmax	Similarity (Y/N)
(defa ult)	0.350	No	0.417	No	0.200	Yes
1	0.200	Yes	0.217	Yes	0.150	Yes
2	0.167	Yes	0.150	Yes	0.217	Yes
3	0.367	No	0.367	No	0.217	Yes
4	0.133	Yes	0.200	Yes	0.133	Yes
5	0.267	No	0.317	No	0.183	Yes
6	0.183	Yes	0.250	No	0.167	Yes
7	0.217	Yes	0.167	Yes	0.133	Yes
8	0.167	Yes	0.167	Yes	0.183	Yes
9	0.233	Yes	0.317	No	0.200	Yes
10	0.217	Yes	0.233	Yes	0.183	Yes
11	0.200	Yes	0.183	Yes	0.133	Yes
12	0.300	No	0.250	No	0.133	Yes
13	0.317	No	0.333	No	0.217	Yes
14	0.133	Yes	0.167	Yes	0.217	Yes

**Table -** Comparison of simulated vs observedintra-subject variability (Full set of individuals,Kolmogorov-Smirnov test)

Bego et al. 2022, AAPS J



Multiple VBE Trials (with N Subjects in Each) to get the:

> <u>Likelihood of</u> <u>Passing the</u> <u>Criteria</u>

Likelihood

- BE Interval (80-125%)
- Predicted Outcomes
- Median of VBE's
- ---- Overlay of Clinical Data

<u>What Is the</u> <u>Right N for VBE?</u>

(1?, ..., 6?, 12?, 24?, ..., 1000?)

### **Applications: Model Drug/Formulation for Local VBE: Budesonide**

![](_page_12_Figure_1.jpeg)

![](_page_13_Picture_0.jpeg)

*pharmaceutics* 

![](_page_13_Picture_2.jpeg)

#### Article

Harnessing the Power of Physiologically Based Pharmacokinetic Modeling to Explore Potential Discordance between in vitro Dissolution, Local Gut vs Systemic Bioequivalence in Health and Disease: The Case of Budesonide in Crohn's Dis-

#### Addressing Local Gut vs Systemic **BE for Complex Generics in Health and** Disease

#### ease

Chunyan Han 1,2,\*, Tiancheng Sun <sup>2</sup>, Sirikalyan Chirumamilla<sup>3</sup>, Frederic Bois<sup>3</sup>, Mandy Xu<sup>2</sup>, Amin Rostami-Hodjegan<sup>1,3,\*</sup>

![](_page_13_Figure_8.jpeg)

**BE Criteria: Heat Map for False/True Positive/Negative BE** 

- Geometric mean of AUC and C<sub>max</sub>
- VBE with 1 trial, 90% confidence intervals of T/R that fall within the limit of 80% - 125% indicate BE - VBE with 10 trials, if ≥ 8 out of 10 trials show bioequivalence, the formulation will be defined as BE.

	Plasma	Local
True positive	BE	BE
True negative	NBE	NBE
False negative	NBE	BE
False positive	BE	NBE

### **VBE Results of Different Intestinal Segments vs Plasma in Healthy Volunteers**

Enterocyte - HV		Duo	Jej1	Jej2	lle1	lle2	lle3	lle4	Col	plasma
+20%	AUC <sub>0-last</sub>	0%	0%	0%	0%	0%	0%	20%	0%	Y
(f <sub>2</sub> =36.1)	C <sub>max</sub>	0%	0%	0%	0%	0%	0%	0%	40%	N
+10%	AUC <sub>0-last</sub>	0%	0%	0%	20%	20%	50%	70%	50%	Y
( <i>f</i> <sub>2</sub> =50.8)	C <sub>max</sub>	0%	0%	0%	0%	20%	30%	60%	80%	N
+5%	AUC <sub>0-last</sub>	30%	40%	30%	60%	70%	80%	90%	70%	Y
( <i>f</i> <sub>2</sub> =65.5)	C <sub>max</sub>	10%	50%	60%	60%	90%	90%	80%	100%	Y
+3%	AUC <sub>0-last</sub>	30%	70%	60%	70%	80%	90%	90%	80%	Y
(f <sub>2</sub> =75.8)	C <sub>max</sub>	20%	80%	90%	90%	90%	90%	90%	100%	Y
-5%	AUC <sub>0-last</sub>	30%	40%	60%	70%	100%	90%	90%	100%	Y
( <i>f</i> <sub>2</sub> =65.5)	C <sub>max</sub>	20%	30%	80%	80%	100%	90%	90%	100%	Y
-10%	AUC <sub>0-last</sub>	0%	0%	10%	20%	40%	60%	70%	70%	Y
( <i>f</i> <sub>2</sub> =50.8)	C <sub>max</sub>	0%	0%	0%	0%	20%	30%	60%	100%	N
DH throshold-E	AUC <sub>0-last</sub>	0%	50%	60%	80%	100%	90%	90%	100%	Y
PH threshold=5	C <sub>max</sub>	0%	60%	90%	100%	100%	90%	90%	100%	Y
DH throshold-6	AUC <sub>0-last</sub>	10%	10%	20%	70%	100%	90%	90%	100%	Y
PH threshold=6	C <sub>max</sub>	10%	10%	30%	90%	90%	90%	80%	100%	Y

#### **Combine AUC and C**<sub>max</sub> together

Enterocyte HV	Duoden um	Jejunum	lleum	Colon	Plasma
20% ( <i>f</i> <sub>2</sub> = <b>36.1</b> )	Ν	N	Ν	Ν	N
10% ( <b>f</b> 2=50.8)	N	N	Ν	Ν	N
5% ( <i>f</i> <sub>2</sub> =65.5)	N	N	N	N	Y
3% ( <b>f</b> <sub>2</sub> =75.8)	N	N	Y	Y	Y
-5% ( <i>f</i> <sub>2</sub> =65.5)	N	N	Y	Y	Y
-10% ( <i>f</i> <sub>2</sub> =50.8)	Ν	N	Ν	Ν	N
PH threshold=5	N	N	Y	Y	Y
PH threshold=6	N	N	Y	Y	Y

Bioequivalent locally Green: true positive

pink: false negative

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### **VBE Results in Different Intestinal Segments vs Plasma in CD Patients**

Enterocyte-CD		Duo	Jej1	Jej2	lle1	lle2	lle3	lle4	Col	plasma	
+20%	AUC <sub>0-last</sub>	0%	0%	0%	0%	0%	0%	30%	0%	Y	
(f <sub>2</sub> = <b>36.1</b> )	C <sub>max</sub>	0%	0%	0%	0%	0%	0%	10%	70%	Ν	
+10%	AUC <sub>0-last</sub>	0%	0%	0%	10%	20%	60%	70%	70%	Y	
(f <sub>2</sub> =50.8)	<b>C</b> <sub>max</sub>	0%	0%	0%	0%	30%	70%	90%	90%	Y	
+5%	AUC <sub>0-last</sub>	50%	20%	20%	30%	70%	70%	90%	90%	Y	
(f <sub>2</sub> =65.5)	<b>C</b> <sub>max</sub>	10%	30%	40%	80%	80%	90%	90%	100%	Y	
+3%	AUC <sub>0-last</sub>	60%	50%	30%	70%	80%	90%	90%	90%	Y	
(f <sub>2</sub> = <b>75.8</b> )	<b>C</b> <sub>max</sub>	40%	60%	80%	90%	90%	90%	90%	100%	Y	
-5%	AUC <sub>0-last</sub>	50%	40%	40%	50%	60%	70%	90%	100%	Y	
(f <sub>2</sub> =65.5)	<b>C</b> <sub>max</sub>	40%	20%	40%	80%	80%	80%	90%	100%	Y	
-10%	AUC <sub>0-last</sub>	0%	0%	0%	10%	30%	30%	50%	80%	Y	
(f <sub>2</sub> =50.8)	<b>C</b> <sub>max</sub>	0%	0%	0%	0%	0%	20%	50%	100%	Y	
PH threshold=5	AUC <sub>0-last</sub>	40%	30%	40%	80%	80%	90%	90%	100%	Y	
PH Inreshold=5	C <sub>max</sub>	30%	70%	90%	90%	90%	90%	90%	100%	Y	
DH threshold-6	AUC <sub>0-last</sub>	10%	10%	20%	80%	80%	90%	90%	100%	Y	
in the shou-0	C <sub>max</sub>	0%	30%	60%	90%	90%	90%	90%	100%	Y	

**Bioequivalent** locally

#### **Combining AUC and C**<sub>max</sub> together

Enterocyte HV	Duoden um	Jejunum	lleum	Colon	Plasma
20% ( <i>f</i> <sub>2</sub> = <b>36.1</b> )	Ν	Ν	Ν	Ν	N
10% ( <i>f</i> <sub>2</sub> =50.8)	N	N	N	N	Y
5% ( <i>f</i> <sub>2</sub> =65.5)	N	N	N	Y	Y
3% (f <sub>2</sub> =75.8)	N	N	Y	Y	Y
-5% ( <i>f</i> <sub>2</sub> =65.5)	N	N	N	Y	Y
-10% ( <i>f</i> <sub>2</sub> =50.8)	N	N	N	Y	Y
PH threshold=5	N	N	Y	Y	Y
PH threshold=6	N	N	Y	Y	Y

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Green: true positive

pink: false negative

Light green: true negative

**Red: false positive** 

## **Conclusion – Incorporation of WSV in BE**

- (1) WSV in physiology propagates to PK and manifest itself as WSV in PK
- (2) The same WSV of GI tract physiology cand lead to a varying WSV in PK for different formulations
- (3) Hence; WSV of PK is NOT independent of Formulation
- (4) Not all WSV for physiology of GI tract are measured (can be estimated)
- (5) WSV of PK can be predicted using WSV of physiology via Population-Based PBPK platforms
- (6) BE based on Systemic Circulation ≠ BE Based on the Local GutC-t profile

## VBE - Systems Information & Workflow: Simcyp<sup>™</sup> Biopharm:

# We've done the hard work, so you don't have to! <u>Features and Capabilities</u>

![](_page_18_Picture_2.jpeg)

![](_page_19_Picture_0.jpeg)

When a thing was new, people said that it was not true;

William James When its truth could not be denied, people said it was not important;

When its importance could not be denied, people said that it was not new!

![](_page_19_Picture_5.jpeg)

# Thanks for Listening - Q&A over the Breakout