

Basic principle of stability study design and analysis for product licensure

TIM SCHOFIELD
CMC SCIENCES, LLC

WORKSHOP ON
STATISTICAL ANALYSIS OF STABILITY TESTING

21ST APRIL 2021



Some notes on vaccine stability

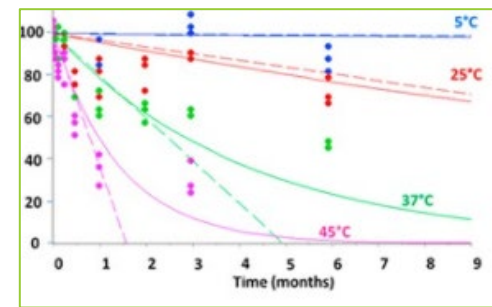
- Stability study goals differ throughout the product lifecycle
- The goal of a vaccine stability study is to estimate an important stability parameter (e.g., slope) rather than demonstrate conformance to specifications
- Stability study design and analysis should be effective at meeting the study goal (e.g., reducing uncertainty)
- Vaccine properties such as potency should remain within appropriate minimum and maximum requirements throughout shelf life
- The goal of lot release is to demonstrate that a manufactured lot will be effective throughout shelf life

Outline

- Some basis concepts
- Studies supporting product licensure
- Example of shelf life determination for a measles vaccine
- Determination of release potency
- Accelerated stability and its use in the release model
- Managing the release limit through design
- Summary

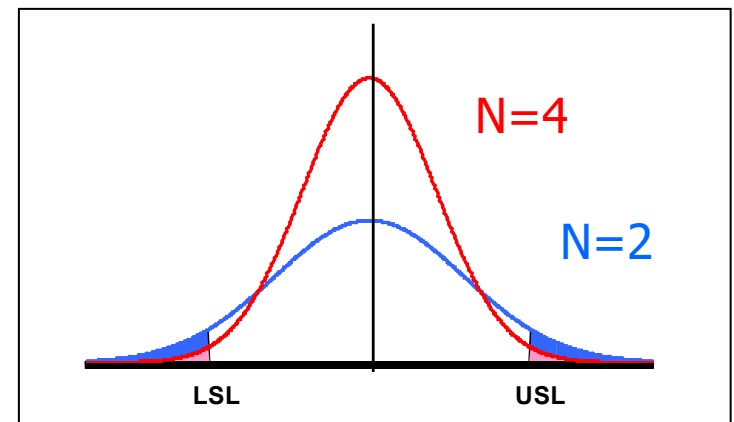
Some basic concepts

- Most vaccines are unstable
 - Require storage from 2-8°C (protein and conjugated polysaccharide vaccines) to -70 °C (mRNA vaccines)
- Kinetics are often 1st order (esp. potency)
 - $y = a \cdot e^{-bt}$ or $\ln(y) = \ln(a) - bt$
 - Revealed in early accelerated stability studies
- Most meaningful attributes of vaccines are measured using highly variable assays
 - e.g., potency – *in vivo* for older vaccines (>50% GCV)



Some basic concepts (cont.)

- Stability studies should be designed to provide a suitable fit to statistical (e.g., kinetics) models
- Statistical design is aimed at controlling (minimizing) the uncertainty associated with the statistical model
 - Uncertainty = $z \cdot \text{Variability}$ (e.g., 2-sigma)
 - Lower uncertainty results in lower risk
 - Risk (e.g., probability of an OOS) can be visualized as the area under a normal curve
 - Stability design elements include replication, time points, and ranges between time points



Studies supporting product licensure

- Studies supporting product licensure include
 - Long term stability of drug substance (DS)
 - Long term stability of drug product (DP)
 - Accelerated stability at conditions of handling, excursion, and use

Studies supporting product licensure

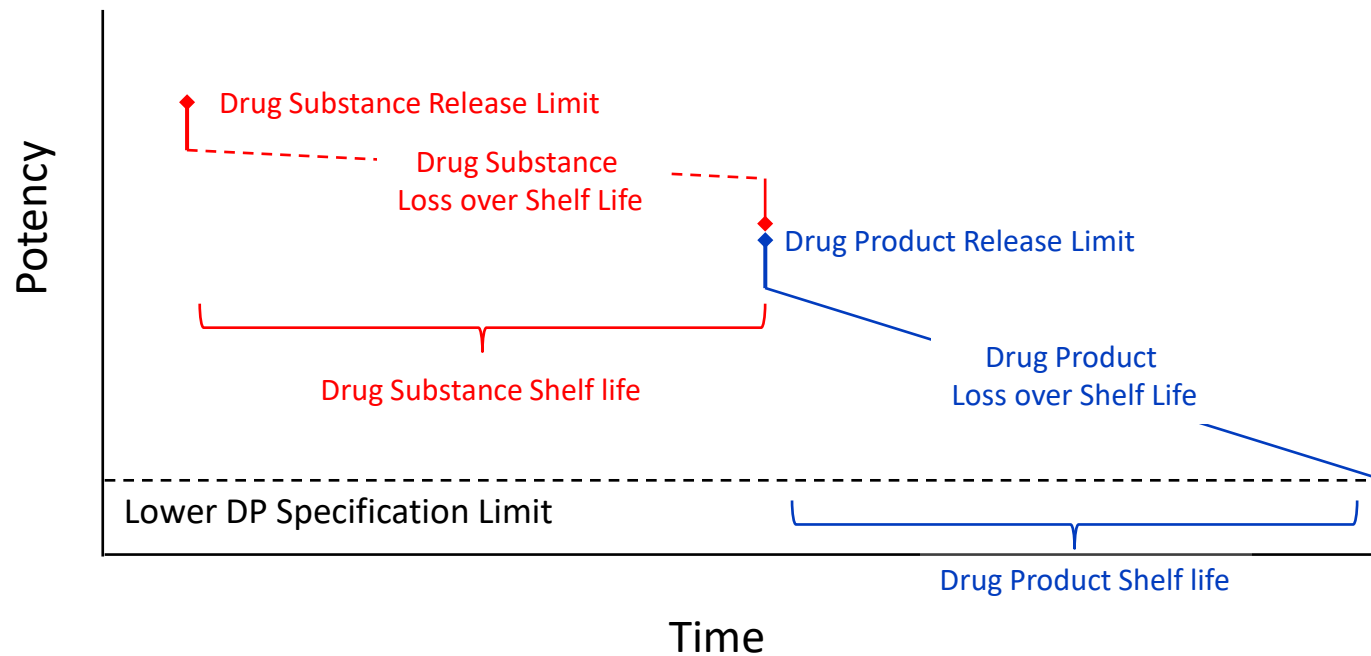
Long term stability of drug substance

- Study goal:
 - Establish that DS can be stored at a specified storage condition for a specified period of time without impact on final product quality
- Quality criteria:
 - DS is suitable for filling into final container throughout DS shelf life
 - ***Adequate potency to ensure meeting target DP potency***
 - Note: this is a business risk

Studies supporting product licensure

Long term stability of drug substance (cont.)

- ***Adequate potency to ensure meeting target DP potency***



Studies supporting product licensure

Long term stability of drug substance (cont.)

- Cumulative age studies
 - Difficult to simulate the total age (DS + DP) of an antigen during development
 - Some DS's are stored 5 to 10-years
 - DP undergoes multiple temperature transitions
 - “Modeling” cumulative age is preferred to “studying” cumulative age
 - Accelerated stability studies may be performed to experimentally demonstrate cumulative age can be modeled rather than studied
 - e.g., Compare stability of DP which has been filled after accelerated aging of DS and not
 - Can be verified as part of ongoing monitoring of vaccine stability
 - Assess relationship of DP stability to age of DS

Studies supporting product licensure

Long term stability of final container product

- Goal:
 - Establish shelf-life of DP, or
 - Develop a release model for DP
- Quality criteria:
 - Satisfactory potency through product shelf-life
 - Maintenance of levels of factors which might impact stability
 - Moisture of a lyophilized vaccine
 - pH of an aluminum adjuvanted vaccine

Studies supporting product licensure

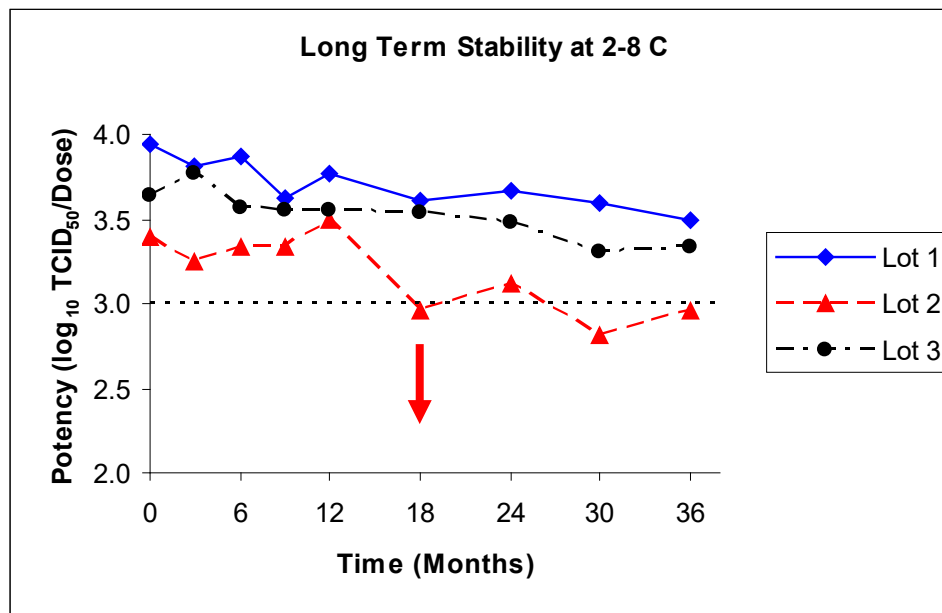
Example of shelf life determination for a measles vaccine

- Typical design of 3 lots tested at ICH timepoints
 - Lower specification limit is $3.0 \log_{10} \text{TCID}_{50}/\text{mL}$

| Time (Months) | Potency ($\log_{10} \text{TCID}_{50}/\text{mL}$) | | |
|---------------|----------------------------------------------------|-------|-------|
| | Lot 1 | Lot 2 | Lot 3 |
| 0 | 3.94 | 3.39 | 3.63 |
| 3 | 3.81 | 3.24 | 3.76 |
| 6 | 3.87 | 3.33 | 3.56 |
| 9 | 3.62 | 3.33 | 3.56 |
| 12 | 3.77 | 3.49 | 3.56 |
| 18 | 3.61 | 2.95 | 3.53 |
| 24 | 3.67 | 3.11 | 3.47 |
| 30 | 3.59 | 2.81 | 3.30 |
| 36 | 3.49 | 2.96 | 3.33 |

Studies supporting product licensure

Example of shelf life determination for a measles vaccine (cont.)

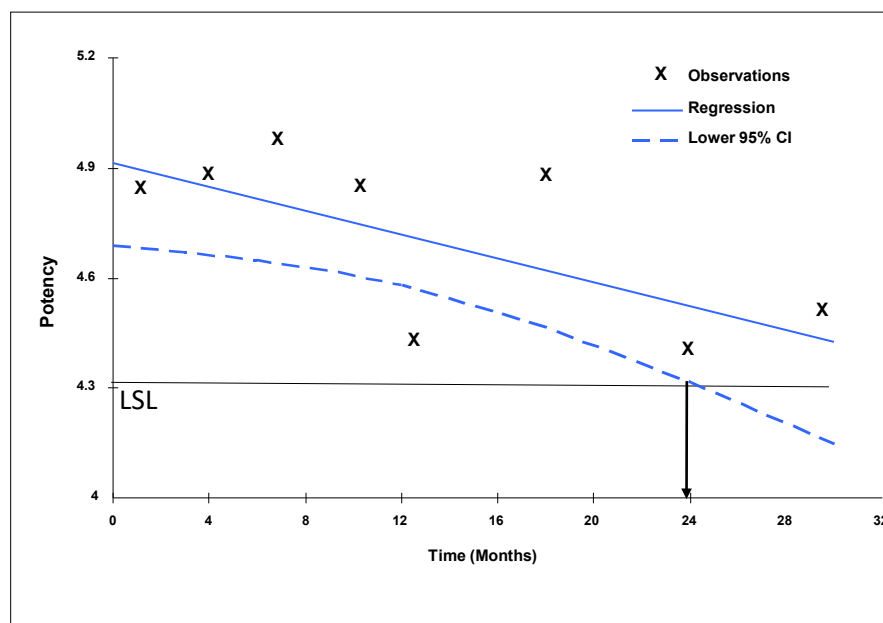


- Is shelf-life 12-months due to a measured value for Lot 2 below the lower specification limit at 18-months?
- Individual measurements do not effectively address the stability of the lot

Studies supporting product licensure

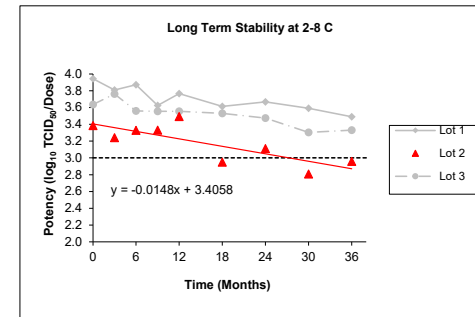
Example of shelf life determination for a measles vaccine (cont.)

- ICH analysis (Q1E)
 - Goal: establish shelf-life
 - 3-lots (ICH Guidance)
 - Fit a statistical model
 - Tests parallelism and level (poolability)
 - Pooled or worst case
 - Shelf life is the intersection of the lower specification limit (LSL) and the lower 1-sided 95% confidence bound on the regression line



Studies supporting product licensure

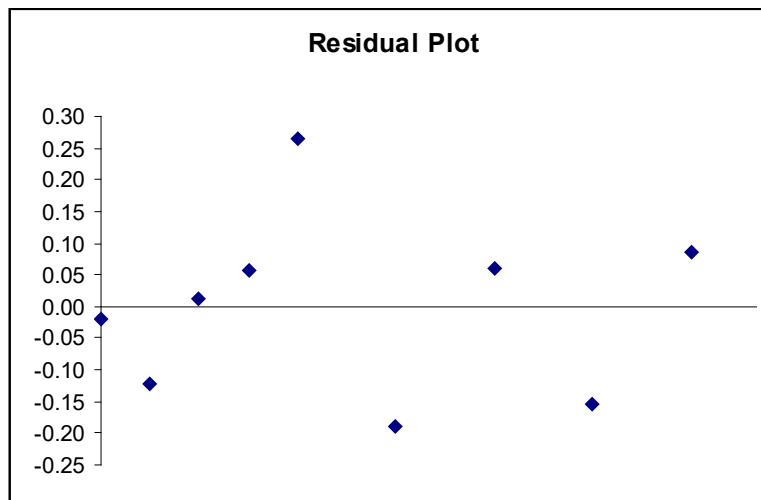
Example of shelf life determination for a measles vaccine (cont.)



Example – live attenuated measles vaccine (cont.)

- Evaluation of Lot 2 alone

| Variable | DF | Parameter Estimate | Standard Error | t Value | Pr > t |
|-----------|----|--------------------|----------------|----------|---------|
| Intercept | 1 | 3.40627 | 0.08192 | 41.58 | <.0001 |
| month | 1 | -0.01483 | 0.00424 | -3.50 | 0.0100 |
| Root MSE | | 0.14976 | | R-Square | 0.6365 |



- No pattern in the residuals (deviations of the observed points from the line)
- Root MSE (assay variability) is typical for the potency assay (~0.15 log)
- The slope is statistically significant (P=0.01)

Studies supporting product licensure

Example of shelf life determination for a measles vaccine (cont.)

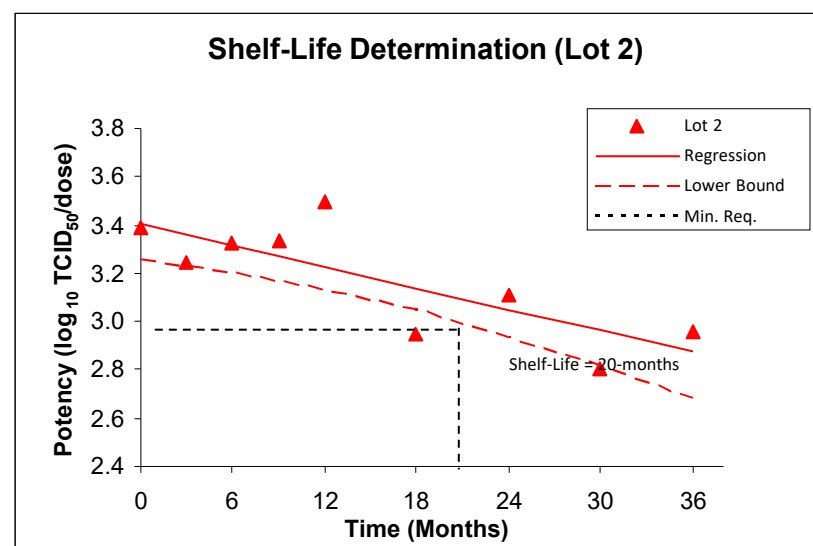
Evaluation of Lot 2 alone (cont.)

- Shelf-life determination

$$\text{Lower 95\% CB} = \hat{y} - t_{0.05,df} \cdot s \cdot \sqrt{\frac{1}{n} + \frac{(t - t_{\text{avg}})^2}{SXX}}$$

where $\hat{y} = \hat{a} + \hat{b} \cdot t$

| Month | CB | |
|-----------|-------------|-------|
| 18 | 3.04 | |
| 19 | 3.03 | |
| 20 | 3.01 | ≥3.00 |
| 21 | 2.99 | <3.00 |
| 22 | 2.97 | |
| 23 | 2.95 | |
| 24 | 2.93 | |



Studies supporting product licensure

Example of shelf life determination for a measles vaccine (cont.)

Evaluation using all lots

- Establishing poolability

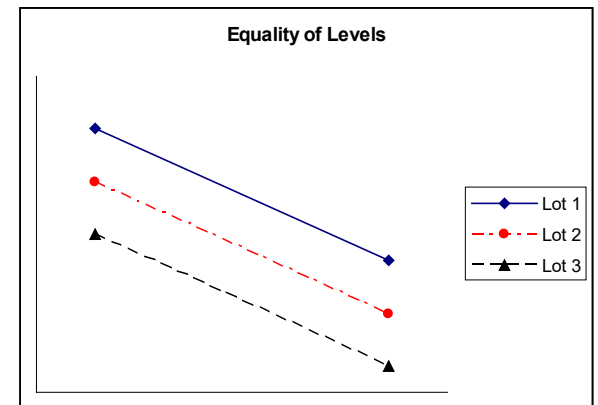
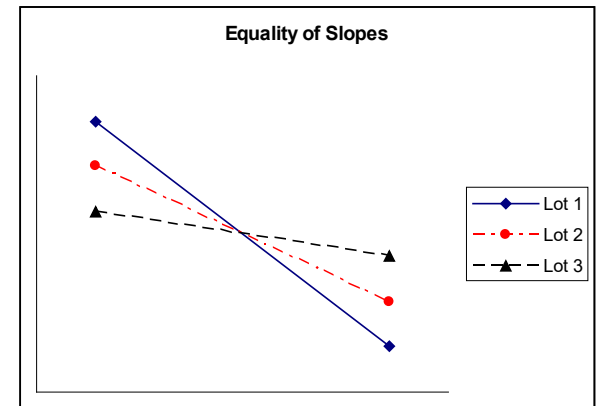
- Equality of slopes is established using a formal test of parallelism –

parallel if P-value sufficiently high ($P=0.4682 > 0.25$)

| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|-----------|----|------------|-------------|---------|--------|
| lot | 2 | 1.29609630 | 0.64804815 | 59.83 | <.0001 |
| month | 1 | 0.52348819 | 0.52348819 | 48.33 | <.0001 |
| month*lot | 2 | 0.01704605 | 0.00852303 | 0.78 | 0.4682 |

- Equality of levels is tested after fitting a common slope – equal levels if P-value is sufficiently high ($P < 0.0001$ is not > 0.25)

| Source | DF | Type I SS | Mean Square | F Value | Pr > F |
|--------|----|------------|-------------|---------|--------|
| lot | 2 | 1.29609630 | 0.64804815 | 60.96 | <.0001 |
| month | 1 | 0.52348819 | 0.52348819 | 49.24 | <.0001 |

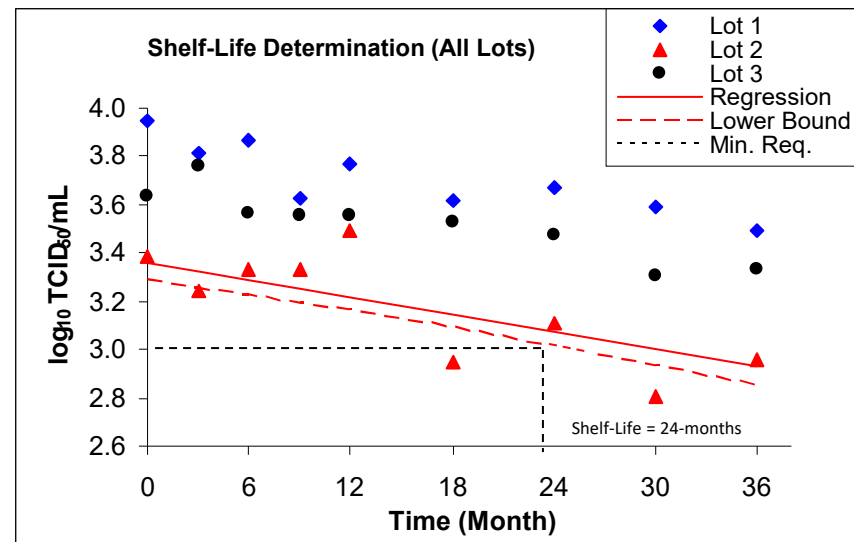


Studies supporting product licensure

Example of shelf life determination for a measles vaccine (cont.)

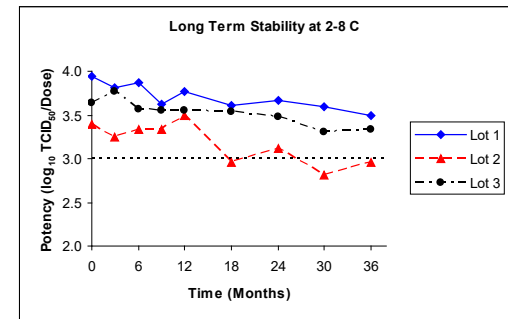
- Evaluation using all lots (cont.)
 - Shelf-life determination
 - Utilizing a model with common slope but different levels
 - Use “worst case” lot (lot 2) to determine shelf-life

| Month | LB | |
|-----------|-------------|-------|
| 21 | 3.05 | |
| 22 | 3.04 | |
| 23 | 3.02 | |
| 24 | 3.01 | ≥3.00 |
| 25 | 3.00 | <3.00 |
| 26 | 2.99 | |
| 27 | 2.97 | |



Studies supporting product licensure

Example of shelf life determination for a measles vaccine (cont.)

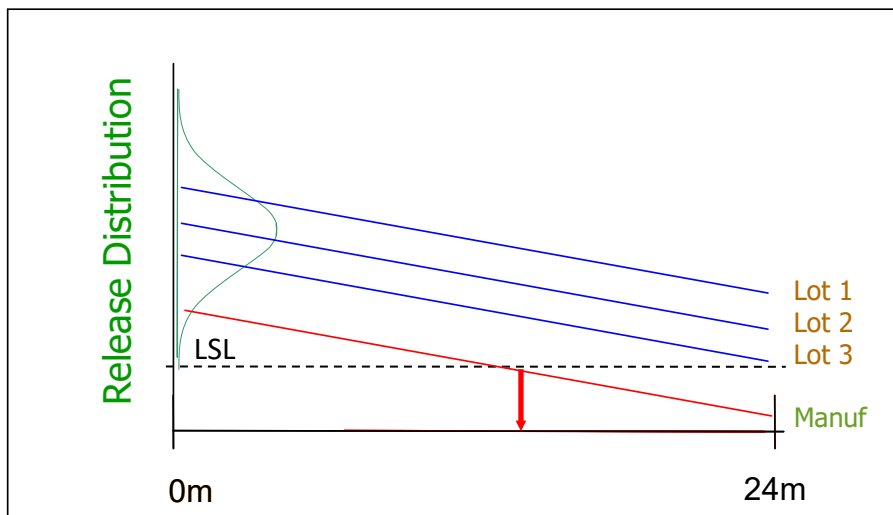


Comparison of approaches

| Approach | Estimate | Comments |
|-------------------------|-----------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Individual Measurements | 12-months | Does not effectively use all the data to show potency trend; post 12-month potencies are within specification. |
| Individual Lot | 20-months | Effectively uses data for the worst case lot to estimate shelf-life; does not use the full power of the long term stability study. Recommended if the loss rates are not comparable among lots. |
| Combined Lots | 24-months | Effectively uses all the data from the long term stability study. Recommended if the loss rates are comparable among lots. |

Determination of release potency

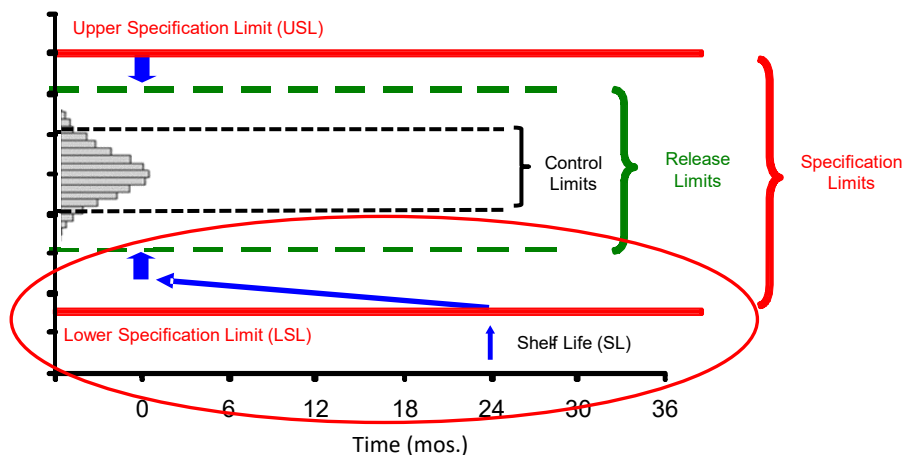
- ICH stability evaluation does not ensure quality of manufactured lots throughout shelf life



- ICH 1E: Determine shelf life from pooled ($n = 3$) or worst-case lot
- However, stability lots do not represent the total distribution of release potencies of future manufactured lots
- Manufactured lots which are released below the distribution of stability lots are predicted to fall below the lower specification limit (LSL) prior to expiry

Determination of release potency (cont.)

- A vision for the vaccine analytical control strategy



- Scientifically/clinically justified upper and/or lower specification limits
- Release limits calculated to ensure quality at release and throughout shelf-life
- Control limits formulated to help manage manufacturing consistency

$$\text{Lower Release} = LSL + b \cdot SL + z_{\alpha} \sqrt{(s_b \cdot SL)^2 + s_{Assay}^2}$$

Schofield, Licensure, 2009

$b = \text{slope/month}$

$z_{\alpha} = \text{statistical factor}$
(95% confidence)

$s_b = \text{variability of slope}$

$s_{Assay} = \text{assay variability}$

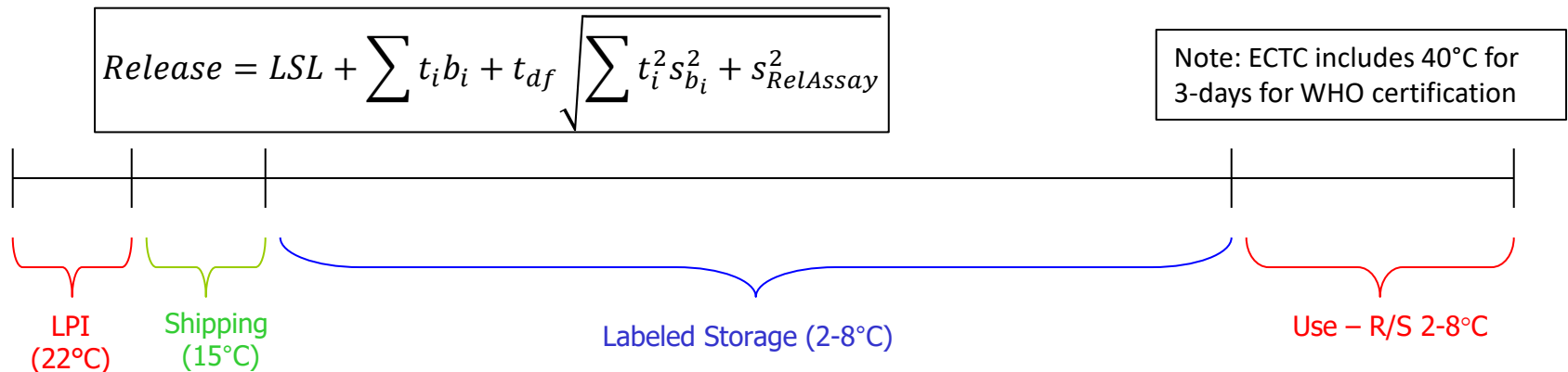
Accelerated Stability

- Uses of accelerated stability
 - Development
 - Formulation development
 - Mechanism of degradation
 - Method validation
 - Handling and use protocols
 - ***Release modeling***
 - Post licensure
 - Stability monitoring
 - Stability comparability protocols
 - Managing excursions

Use of accelerated stability in the release model

- Guidelines

- WHO *Guidelines on Stability Evaluation of Vaccines* (2006)
- WHO *Guidelines on the stability evaluation of vaccines for use under extended controlled temperature conditions* (ECTC, 2015)



Use of accelerated stability in the release model (cont.)

$$\text{Release} = \text{Expiry} + \sum t_i b_i + t_{df} \sqrt{\sum t_i^2 s_{b_i}^2 + s_{\text{Assay}}^2}$$

| Condition | Temperature | Loss Rate | Std.Err. | Time at Condition | Loss | Error |
|-----------------------------------|-------------|------------|----------|-------------------|------------------------|-----------------------|
| Labeling, Packaging, & Inspection | 20-25° C | 0.0025/hr. | 0.0005 | 24-hrs. | 0.06 | 0.012 |
| Self-Life | 2-8° C | 0.012/mo. | 0.0017 | 24-mos. | 0.29 | 0.041 |
| Reconstitute & Store | 2-8° C | 0.0031/hr. | 0.0005 | 8-hrs. | 0.025 | 0.004 |
| Release Assay Variability | | | 0.08 | | | 0.08 |
| | | | | | Total Loss = 0.3728 | Total Error = 0.0907 |
| | | | | | Clinical Minimum = 3.0 | Minimum Release = 3.5 |

$$\begin{aligned} \sum t_i \cdot b_i &= 24 \cdot 0.0025 + 24 \cdot 0.012 + 8 \cdot 0.0031 \\ &= 0.06 + 0.29 + 0.025 = 0.3728 \end{aligned}$$

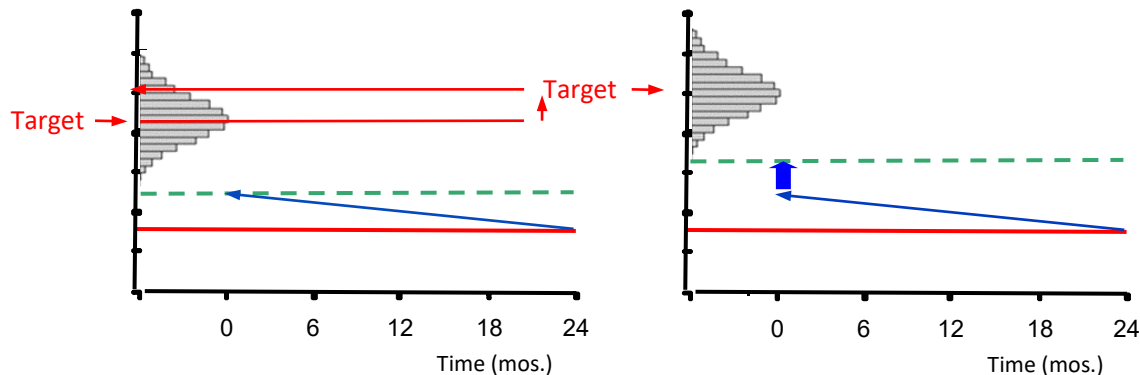
$$\begin{aligned} \sqrt{\sum t_i^2 \cdot s_{b_i}^2 + s_{\text{Assay}}^2} &= \sqrt{24^2 \cdot 0.0005^2 + 24^2 \cdot 0.0017^2 + 8^2 \cdot 0.0005^2 + 0.08^2} \\ &= \sqrt{0.012^2 + 0.041^2 + 0.004^2 + 0.08^2} = 0.0907 \end{aligned}$$

$$\text{Release} = 3.0 + 0.3728 + 1.645 \cdot 0.0907 = 3.5$$

Managing the release limit through design

$$\text{Release} = 3.0 + 0.3728 + 1.645 \cdot 0.0907 = 3.5$$

- The “uncertainty” in the release limit calculation contributes:
 $1.645 \cdot 0.0907 = 0.15$ log (~30%) to the total loss + uncertainty
- Results in an increase in the manufacturing target



- Forces production towards the upper specification limit (i.e., greater risk of OOS)
- Decreases capacity, and thus availability to the customer

Managing the release limit through design

Reduce potency assay variability through strategic replication

$$Release = LSL + \sum t_i b_i + t_{df} \sqrt{\sum t_i^2 s_{b_i}^2 + s_{RelAssay}^2}$$

$$s_{RelAssay}^2 = \frac{s_{Between}^2}{r} + \frac{s_{Within}^2}{nr}$$

| n | Runs (r) | | | |
|---|----------|-----|-----|-----|
| | 1 | 6 | 9 | 12 |
| 1 | 44% | 16% | 13% | 11% |
| 2 | 41% | 15% | 12% | 10% |
| 3 | 39% | 15% | 12% | 10% |

- Variance components ($s_{Between}^2$ and s_{Within}^2) are from assay validation
- Combinations of number of runs (r) and number of reps within runs (n) can be explored to reduce release assay variability
- The “Reportable Value” is the average
- The stability testing format needn’t be the same as release testing
 - The goal of stability testing is different than the goal of release testing

Managing the release limit through design

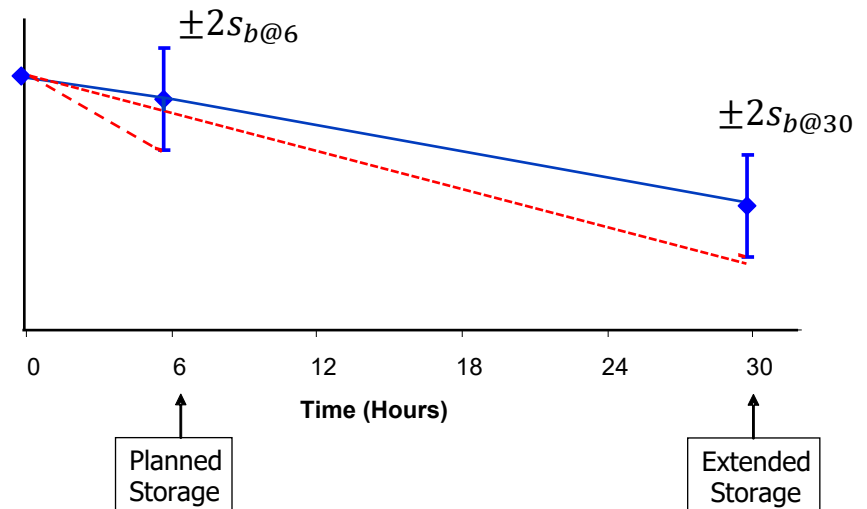
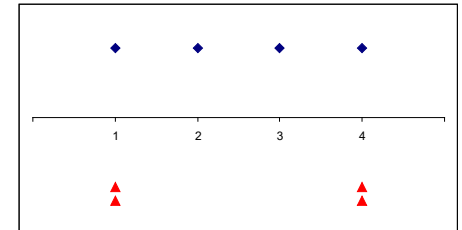
Reduce slope variability through strategic stability study design

$$Release = LSL + \sum t_i b_i + t_{df} \sqrt{\sum t_i^2 s_{b_i}^2 + s_{RelAssay}^2}$$

- Stability variability is managed through strategic selection of time points
 - Test at beginning and end of study
 - Significant reduction in variability (25%)
 - Note: assumes linear kinetics
 - Test at extended intervals

$$s'_{b@6} = s_{b@30} / \sqrt{5}$$

| Design 1 | Design 2 |
|---------------|------------|
| 1 | 1 |
| 2 | 1 |
| 3 | 4 |
| 4 | 4 |
| $s_b=0.45$ | $s_b=0.33$ |
| Reduction=25% | |



Managing the release limit through design

Other opportunities to reduce variability

- Calibration to a standard
- Reference to an unincubated sample (-70° C) from the same lot
- Staged testing
 - Appropriate when the slope is the parameter of interest, and there is significant run-to-run variability
 - Withdraw samples at stability time points, store at -70° C, test together with unincubated samples
 - Requires sophisticated statistical design and analysis is required
 - Analysis of covariance

Some current barriers

- Lack of separate release and end-of-shelf-life limits
- Setting shelf life based on individual values
 - Last time point within specification
 - Modeling individual values using a prediction interval versus a confidence interval
- Incorrect kinetics modeling
 - Zero versus first order
- Sequential stability studies
 - A study holding a DS through shelf life, then formulated and held through DP shelf life
 - End-to-end modeling versus end-to-end studies

Summary

- Drug substance (bulk) evaluation addresses whether the intermediate will be suitable for filling into drug product (DP) throughout its shelf life
- Cumulative age may be addressed post licensure, or using accelerated stability to simulate suitability of aged DS
- Accelerated stability studies are used throughout development and post licensure to address development questions and to forecast impact on product which has been exposed to elevated temperatures
- Statistical methods make use of all the data to obtain a reliable estimate of product shelf-life
- A release model can be used to help assure a commercial lot will maintain adequate potency after handling, shipment, long-term storage, and use

References

1. Schofield, TL (2009) *Vaccine stability study design and analysis to support product licensure*; *Biologicals* 37 (2009) 387-396.
2. Schofield, TL (2009) *Maintenance of vaccine stability through annual stability and comparability studies*; *Biologicals* 37 (2009) 397-402
3. *WHO Guidelines for Stability Evaluation of Vaccines* (2006)
4. *WHO Guidelines on the stability evaluation of vaccines for use under extended controlled temperature conditions* (ECTC, 2015)
5. Fairweather WR, Mogg R, Bennett PS, Zhong J, Morrissey C, Schofield TL. (2003) *Monitoring the stability of human vaccines*. *Journal of Biopharmaceutical Statistics*; 13: 395-413.
6. Schofield, TL, et.al. (2006) *Monitoring the stability of human vaccines*, presented at WCBP, SF
7. Gorko, MA (2003) *Identification of Out-of-Trend Stability Results*, *Pharmaceutical Technology*; 27(4)
8. Noël C, Charles S, Francon A, Flandrois JP (2001) *A mathematical model describing the thermal virus inactivation*. *Vaccine*;19:3575-82.
9. Yu, B, Zeng, L (2015) *Evaluating the comparability of stability at long-term storage temperature using accelerated stability data*, IABS Statistical Meeting, September 29-30
10. Sidor, L, Burdick, R, Cowley, D, Kendrick, BS, (2011) *Demonstrating comparability of stability profiles using statistical equivalence testing*, *BioPharm International*; 24 ,36-42
11. Burdick, RK, Sidor, L, (2013) *Establishment of an equivalence acceptance criterion for accelerated stability studies*, *Journal of Biopharmaceutical Statistics*; 23, 730-743

Thank you

Questions?

tim@cmcsiences.com