Session 4b: PKPD Modeling of Antibody-Drug Conjugate (Symposium) October 14, 2014, Las Vegas, NE

# **Approaches to Modeling Clinical PK of ADCs**

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# **Antibody-Drug Conjugates**

- Antibody (or antibody fragment) linked (through a chemical linker) to a payload (cytotoxic small molecule)
- > Designed to:
  - Bind to its antigen on the surface of tumor cells
  - Be efficiently internalized through endocytosis
  - Release payload (toxin) in the lysosome and kill target cells

### **ADCs are mixtures with dynamically changing heterogeneity**



- Heterogeneity due to conjugating through amino acid residues on the antibody
- Dynamic heterogeneity due to deconjugation



Drug-to-antibody (DAR) ratio distribution

From Lin, Tibbitts. Pharm Res (2012) 29:2353-2366

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### **ADC** Assays

- Usually include concentrations of:
  - Total antibody (ADC + naked antibody)
  - Free toxin (unconjugated)
- ➤ Also include one or more of :
  - Conjugated toxin (all toxin molecules on all antibodies)
  - ADC (conjugated antibody)
  - Naked antibody (unconjugated)
- Rarely (at preclinical stage), but possibly more often in the future
  - Individual ADC species of different DARs

$$acT = \sum_{i=0}^{8} i \cdot C^{i}$$
$$\sum_{i=1}^{8} C^{i}$$

 $C^{i}, i=1,...,8,...$ 

 $C = \sum_{i=0}^{\circ} C^i = tAB$ 

Т

## What to Measure at Clinical Stage?

- The question is not completely settled;
- ➤ I am in favor of measuring these three analytes:
  - Total antibody (ADC + naked antibody)
  - Free toxin (unconjugated)
  - Conjugated toxin (all toxin molecules on all antibodies)  $acT = \sum i \cdot C^{i}$
- ➤ Why?
  - Total antibody may be needed to assess effects of the drug that are independent of the toxin;
  - Unconjugated toxin is needed to assess safety, as it is extremely toxic;
  - Conjugated toxin is most likely responsible for the ADC-induced efficacy.

$$C = \sum_{i=0}^{8} C^i = tAB$$

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# ADC TMDD Model [1]

Black: rate constants

ADC<sub>i</sub> component of the ADC system k<sup>i+1</sup>dec A<sup>i+1</sup> IV Dose Di k<sub>svn</sub> \* V<sub>C</sub>  $k_{on} * C^{i}$ k<sub>on</sub>\*R k<sup>i</sup>dec ADC<sub>i</sub> Central ADC<sub>i-1</sub> Target  $\underline{A}_{p}^{i} = \underline{C}^{i} * V_{C}$  $A^{i-1}p$  $R^*V_C$  $\underline{k_{on}}^{*}R^{*}\underline{C}^{i}^{*}V_{C}$ **k**<sub>deg</sub> k<sup>i</sup>el **k**<sub>pt</sub> k<sub>tp</sub> ADC<sub>i</sub>-Target **k**int Complex ADC<sub>i</sub> Peripheral  $RC^{i} * V_{C}$  $A'_t$ **k**off **k**off **k**off

Green: amount;

Red: input;

#### ADC Assumptions

• For ADCs with different DARs, the same

 $V_c, k_{pt}, k_{tp}$ , and  $k_{on}, k_{off}, k_{int}$ 

- Deconjugation occurs in the central compartment
- Eliminated ADCs release toxin to the central compartment (not shown)

[1] L Gibiansky, E Gibiansky, J PKPD, 2014;41(1):35-47 doi: 10.1007/s10928-013-9344-y

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# Assumptions

In addition to the commonly used TMDD assumptions, the system assumes that:

- Different ADC<sup>i</sup> species have the same volume of distribution and intercompartment rate constants, but may differ by non-specific clearance and deconjugation rate;
- Different ADC<sup>i</sup> species have the same binding and internalization constants k<sub>on</sub>, k<sub>off</sub> and k<sub>int</sub>;

Possible extensions of the equations such as deconjugation in the peripheral compartment, deconjugation in the ADC-target complex, delayed and/or incomplete release of the toxin load from the eliminated  $ADC^i$  species are straightforward but are not considered in this talk.

# **ADC Approximations**

As with the general TMDD model, the drug-target association process is usually much faster than the processes of drug dissociation/distribution/elimination and of elimination of the target and the drug-target complex. Following the same scheme as for the TMDD model, the system of ADC TMDD equations can be simplified.

## **ADC Michaelis – Menten Equations**

For mABs with fast internalization of the complex, like ADCs, TMDD elimination can be described by the Michaelis-Menten equations:

$$\begin{aligned} \frac{dC^{i}}{dt} &= \frac{k_{tp}A^{i}{}_{t}}{V_{c}} - \left(k^{i}{}_{el} + k_{pt}\right)C^{i} - \frac{V_{\max}C^{i}}{K_{SS} + C} + k^{i+1}{}_{dec}C^{i+1} - k^{i}{}_{dec}C^{i}; \\ \frac{dA^{i}{}_{t}}{dt} &= k_{pt}C^{i}V_{c} - k_{tp}A^{i}{}_{t}; \quad (k^{0}{}_{dec} = 0; \quad k^{9}{}_{dec} = 0); \\ \frac{dA_{T}}{dt} &= V_{c}\sum_{i=1}^{8} \left(k^{i}{}_{dec}C^{i} + i \cdot k^{i}{}_{el}C^{i} + \frac{i \cdot V_{\max}C^{i}}{K_{SS} + C}\right) - k^{T}{}_{el}A_{T}; \quad A_{T}(0) = 0; \\ C^{i}(0) &= D^{i}/V_{c}; \quad C = \sum_{i=0}^{8}C^{i}; \qquad i = 0, \dots, 8. \end{aligned}$$

If concentrations of individual ADC<sup>i</sup> species are not available, the system is not likely to be identifiable. Additional assumptions (for  $k_{el}^i$  and  $k_{dec}^i$ ) are needed.

### **ADC MM Model**



# **ADC with Load-Independent Properties**

**Earlier assumptions**: different ADC<sup>i</sup> have the same volume of distribution, intercompartment rate constants and binding parameters.

### Additional assumptions:

- Elimination rate is independent of the toxin load:  $k_{el}^i = k_{el}$ ;
- Deconjugation rate of each toxin molecule is independent of the position and the number and positions of other toxins attached to the same ADC<sup>i</sup>.

### <u>ADC with LIP</u>: $\mathbf{k}_{el}^{i} = \mathbf{k}_{el}$ , $\mathbf{k}_{dec}^{i} = \mathbf{i} \cdot \mathbf{k}_{dec}$

Assumptions may or may not hold but they allow a significant simplification of the model equations for ADC.

# Validity of LIP Assumption $k_{el}^i = k_{el}$

| Pro                                                                                                                                                                                                  | Con                                                                                                                      |
|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------------------------------------------------------------------------------------------------------------|
| Each toxin is small (< 1 kDa) and unlikely to change the properties of 150 kDa mAB;                                                                                                                  | Conjugation may change configuration and/<br>or other mAB properties resulting in<br>increase of non-specific clearance; |
| ADC equations with different CL <sup>i</sup> are un-<br>identifiable given the typically available clinical<br>data; DAR-independence of CL is the simplest<br>assumption that stabilizes the model; | Pre-clinical experimental data in mice<br>suggest increase of CL with DAR [3, 4],<br>especially for high-DAR species;    |
| Comparison of models with DAR-proportional<br>and DAR-independent CL indicated similar fit<br>of clinical data [2]                                                                                   | Modeling of preclinical data in monkey suggests increase of CL with DAR [5].                                             |
|                                                                                                                                                                                                      |                                                                                                                          |

- [2] Lu D et al., ACoP 2014, Poster T-011.
- [3] Hamblett KJ et al., (2004) Clin. Cancer Res, 10, 7063-7070
- [4] McDonagh CF et al., (2006) Protein Eng Des Sel., 19(7), 299-307.
- [5] Bender B et al., AAPS J. 2014 Sep;16(5):994-1008. doi: 10.1208/s12248-014-9618-3

# Validity of LIP Assumption $k^{i}_{dec} = i \cdot k_{dec}$

| Pro                                                                                                                                                            | Con                                                                                                                                                |
|----------------------------------------------------------------------------------------------------------------------------------------------------------------|----------------------------------------------------------------------------------------------------------------------------------------------------|
| If probability of deconjugation is<br>independent of the conjugation site, this<br>relation can be easily derived rigorously                                   | If deconjugation probability depends on the conjugation site, k <sup>i</sup> <sub>dec</sub> should increase with DAR faster than DAP-proportional; |
| ADC equations with different k <sup>i</sup> <sub>dec</sub> are un-<br>identifiable given the typically available<br>clinical data                              | Pre-clinical and clinical experimental data suggest position-dependent deconjugation rate for some types of ADCs.                                  |
| DAR-independent k <sup>i</sup> <sub>dec</sub> is hard to justify, as<br>this leads to decreased deconjugation<br>probability of each toxin in high-DAR species | Modeling of preclinical data in monkey<br>suggests DAR-independent k <sup>i</sup> <sub>dec</sub> for DAR >= 3<br>[5]                               |
| Modeling of preclinical data in monkey<br>suggests DAR-proportional increase of k <sup>i</sup> <sub>dec</sub><br>for DAR <= 3 [5]                              |                                                                                                                                                    |

Modeling based on LIP assumptions resulted in a stable model with good fit of all observed total antibody, conjugated toxin, and unconjugated toxin data [2]. The run time of simplified models based on LIP assumptions was 10-fold smaller than for the same models in the original form.

## **Simplified ADC Equations**

LIP assumptions:  $k_{el}^{i} = k_{el}$  and  $k_{dec}^{i} = i \cdot k_{dec}$ 

$$\frac{dC^{i}}{dt} = \frac{k_{tp}A^{i}{}_{t}}{V_{c}} - (k_{el} + k_{pt})C^{i} - \frac{V_{max}C^{i}}{K_{SS} + C} + (i+1)k_{dec}C^{i+1} - i \cdot k_{dec}C^{i}$$
$$\frac{dA^{i}{}_{t}}{dt} = k_{pt}C^{i}V_{c} - k_{tp}A^{i}{}_{t} \qquad i = 0,...,8; \quad C^{9} = 0$$
$$\frac{dA_{T}}{dt} = V_{c}\sum_{i=1}^{8} i \cdot (k_{dec} + k_{el} + \frac{V_{max}}{K_{SS} + C})C^{i} - k^{T}{}_{el}A_{T}$$

Model includes 19 differential equations (if  $i \le 8$ )

If  $C = \sum_{i=0}^{8} C^{i}$  and  $acT = \sum_{i=0}^{8} i \cdot C^{i}$  are measured, the system can be further reduced

### **Reduced ADC model**



All parameters are shared between C and acT systems, except  $\mathbf{k}_{dec}$ 

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### **Reduced ADC equations**

$$\begin{aligned} \frac{dC}{dt} &= \frac{k_{tp}A_{C,t}}{V_c} - \left(k_{el} + k_{pt}\right)C - \frac{V_{\max}C}{K_{SS} + C}; \\ \frac{dA_{C,t}}{dt} &= k_{pt}C \cdot V_c - k_{tp}A_{C,t}; \\ \frac{dacT}{dt} &= \frac{k_{tp}A_{acT,t}}{V_c} - \left(k_{el} + k_{pt} + k_{dec}\right)acT - \frac{V_{\max}acT}{K_{SS} + C}; \\ \frac{dA_{acT,t}}{dt} &= k_{pt}acT \cdot V_c - k_{tp}A_{acT,t} \\ \frac{dA_T}{dt} &= V_c \left(k_{dec} + k_{el} + \frac{V_{\max}}{K_{SS} + C}\right)acT - k^T_{el}A_T; \quad A_T(0) = 0; \\ C(0) &= \frac{D_C}{V_c}; \quad acT(0) = \frac{D_{acT}}{V_c}; \quad C = \sum_{i=0}^8 C^i; \quad acT = \sum_{i=0}^8 i \cdot C^i \end{aligned}$$

Unobserved C<sup>i</sup> concentrations can be computed from the MM equations

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# **Modeling of Unconjugated Toxin Data**

- Three routes for unconjugated toxin to appear in the systemic circulation:
  - ✓ Deconjugation ( $k_{dec}$ ·acT);
  - ✓ Elimination of the ADC via non-specific clearance  $(k_{el} \cdot acT)$ ;
  - ✓ Target-mediated elimination  $(V_{max} \cdot acT/(K_{SS}+C));$
- Each route may have it's own efficiency ("bioavalability") and time delay;

$$\frac{dA_{d1}}{dt} = k_{dec} acT \cdot V_c - k_{d1-T}A_{d1}; \quad acT = \sum_{i=0}^{8} i \cdot C^i;$$

$$\frac{dA_{d2}}{dt} = k_{el} acT \cdot V_c - k_{d2-T}A_{d2}; \quad C = \sum_{i=0}^{8} C^i;$$

$$\frac{dA_{d3}}{dt} = \frac{V_{\max}acT \cdot V_c}{K_{SS} + C} - k_{d3-T}A_{d3};$$

$$\frac{dA_T}{dt} = f_1 \cdot k_{d1-T}A_{d1} + f_2 \cdot k_{d2-T}A_{d1} + f_3 \cdot k_{d3-T}A_{d3} - k^T_{el}A_T; \quad A_T(0) = 0;$$

# **Modeling of Unconjugated Toxin Data**

• Toxin clearance is much higher than ADC clearance: formation-limited kinetics;

$$A_{T} = \frac{f_{1} \cdot k_{d1-T} A_{d1} + f_{2} \cdot k_{d2-T} A_{d1} + f_{3} \cdot k_{d3-T} A_{d3}}{k^{T}_{el}};$$
  
$$T = \frac{f_{1} \cdot k_{d1-T} A_{d1} + f_{2} \cdot k_{d2-T} A_{d1} + f_{3} \cdot k_{d3-T} A_{d3}}{CL_{T}}.$$

- "Bioavailability" parameters  $f_i$  and delay rates  $k_{di-T}$  may not be identifiable;
- Delay process may be non-linear and concentration-dependent;
- Appropriate simplified or more complex models could be developed based on the observed data, see example of implementation in ACoP-2014 poster T-11 [2].

# **Implication of the Integrated Model**

- The integrated ADC PK model (total antibody + conjugated toxin + unconjugated toxin) provides a mechanistic framework for the description of observed ADC PK data;
- Under LIP assumptions, equations that describe PK properties of the total antibody and of the conjugated toxin are very similar; in fact, they differ by just one constant,  $k_{dec}$ ;
- For ADC with LIP, similarity of equations allows to predict total antibody PK from conjugated toxin measurements, and vise versa, see example in ACoP poster T-011 [2].

# Conclusions

- Mechanistic (TMDD) framework for description of ADC PK was developed;
- The Michaelis-Menten approximation of the ADC-TMDD model can be used to describe the interaction of ADC with the target when internalization rate is fast;
- Assumptions that describe dependence of the ADC<sup>i</sup> parameters on drug load are necessary to make the system identifiable;
- For ADC with load-independent properties (LIP)  $k_{el}^{i} = k_{el}$  and  $k_{dec}^{i} = i \cdot k_{dec}$ ;
- Under LIP assumptions, ADC PK can be described by two coupled twocompartment systems with parallel linear and Michaelis-Menten elimination;
- When Michaelis-Menten term is negligible and the systems are linear, the two systems decouple allowing for independent fit;
- Proposed models can be used to describe the observed clinical ADC PK data, including total antibody, conjugated toxin, and unconjugated toxin data;
- The presented model was successfully used for the clinical development of a reallife ADC, see ACoP Poster T-011 [2].

# Any questions?