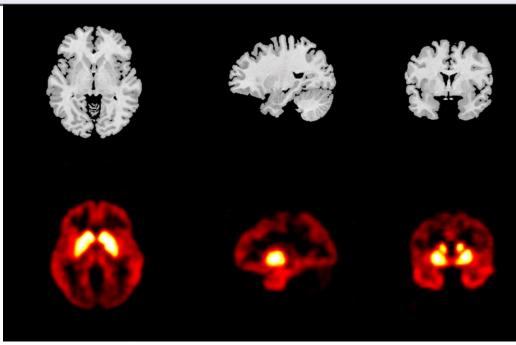
# **Reference Tissue Models**

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#### **Overview**

- Outcome parameters
- Reference tissue
- Reference tissue models
- Linearisations
  - Irreversible models
  - Reversible models





- The term **distribution volume** originates from clinical pharmacology
- In PET:
  - The distribution volume  $V_T$  refer to the volume of plasma needed to account for the radioligand in a brain region when tracer is evenly distributed between brain and plasma





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    - No differentiation between specific and non-specific binding
    - Arterial plasma necessary





- Free plasma concentration:  $BP_F = \frac{B_{\text{max}}}{K_D}$
- Total plasma concentration:  $BP_P =$

• Non-displaceable uptake:  $BP_{ND} =$ 





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$$P_F = \frac{B_{\max}}{K_D} = \frac{V_T - V_{ND}}{f_P}$$

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$$BP_{ND} = f_{ND} \frac{B_{\text{max}}}{K_D} = \frac{V_T - V_{ND}}{V_{ND}}$$





#### **Reference tissue models**

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Advantages:

- No invasive arterial cannulation
- No labor-intensive measuring of radiolabeled metabolites
- Less noise from plasma measurements







### **Reference tissue models**

The time-activity curve of a reference tissue used as an indirect input function can obviate the need for arterial plasma input

Advantages:

- No invasive arterial cannulation
- No labor-intensive measuring of radiolabeled metabolites
- Less noise from plasma measurements



Limitations:

- Only BP<sub>ND</sub> can be achieved, thus not useful when nondisplacable binding could be affected:
  - Biased if radiolabeled metabolites cross the blood-brain-barrier
  - Changes in tissue composition due to illness





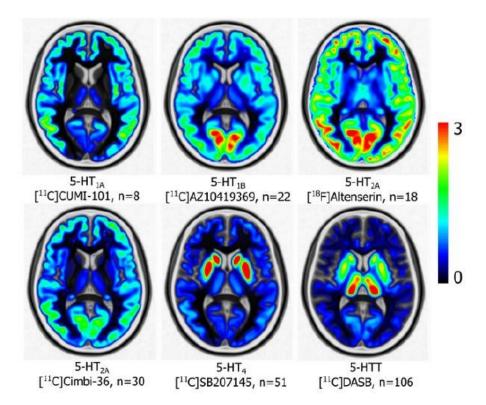


Figure 4. Average  $BP_{ND}$  and  $BP_P$  maps for all tracers mapped on to the MNI152 space (horizontal view). Color scaling is constant across images.

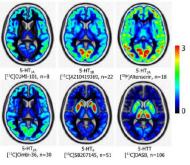
#### BP maps created using 6 different tracers that binds to serotonin receptors and the transporter

Vincent Beliveau, NRU





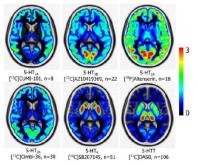
- Demonstrably devoid of specific binding
  - In vitro
  - In vivo
- Similar non-specific binding as the rest of the brain







- Demonstrably devoid of specific binding
  - In vitro
  - In vivo



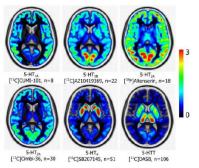
• Similar non-specific binding as the rest of the brain

This should be tested with a blocking study. The blocking agent should:





- Demonstrably devoid of specific binding
  - In vitro
  - In vivo



• Similar non-specific binding as the rest of the brain

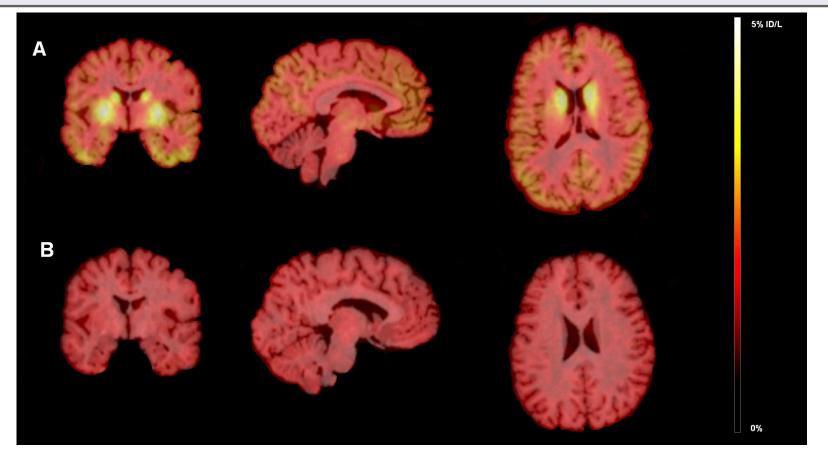
This should be tested with a blocking study. The blocking agent should:

- Selectively bind to the same receptor with high affinity
- Be structurally dissimilar
- Non-toxic in high doses
- Cross the blood-brain-barrier





#### **Blocking Study – part 1**



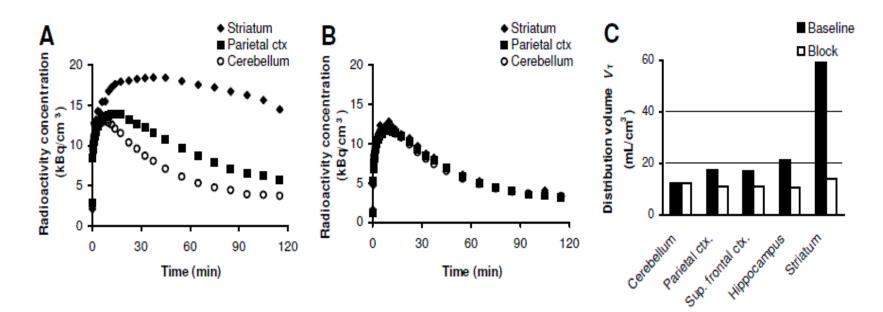
Baseline (A) and a blocked (B) [<sup>11</sup>C]SB207145 scan (male, 29 years) before and after oral administration of 150 mg Piboserod, an inverse agonist for 5-HT<sub>4</sub> (SB207266), structurally dissimilar to [<sup>11</sup>C]SB207145.

(Marner et al., 2009 JNM 50(6):900-8)





# **Blocking Study – part 2**



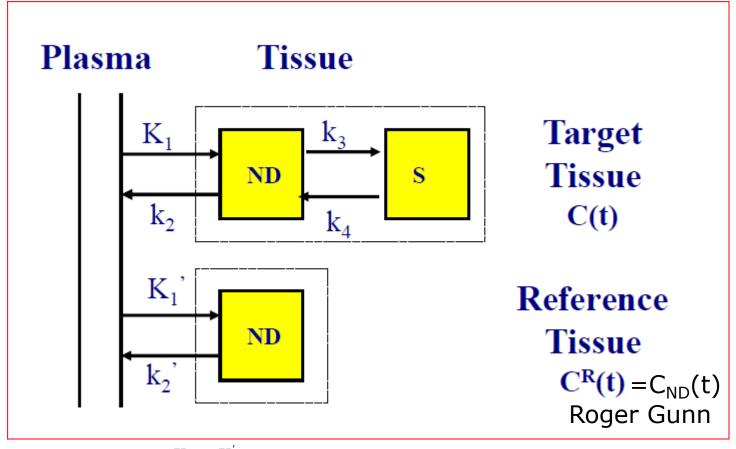
Time activity curves for the baseline (A) and the blocked (B) scans. After administration of Piboserod, the [ $^{11}$ C]SB207145 distribution volumes (C) are reduced to the level of cerebellum at baseline (n=2).

(Marner et al., 2009 JNM 50(6):900-8)





### **Full Reference Tissue Model**



Assumption:  $\frac{K_1}{k_2} = \frac{K_1}{k_2}$  non specific binding the same

#### ND: Non-Displacable binding, S: Specific binding





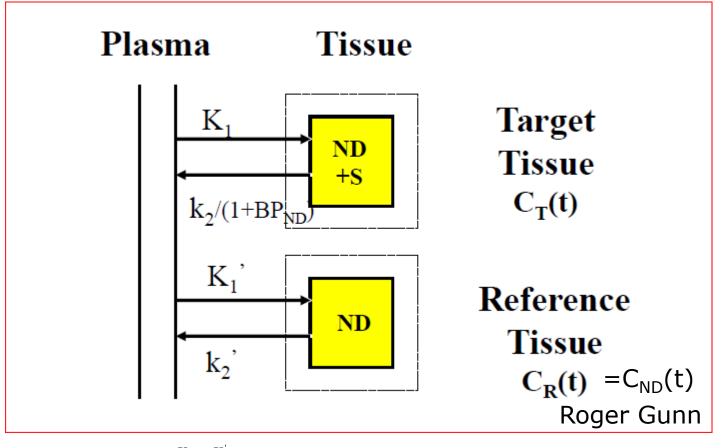
# **Full/Simplified Reference Tissue Model**

- Full: Four parameter model (Cunningham et al., 1991, JCBFM)
  - $R_1 = K_1 / K_1'$ ,  $k_2$ ,  $k_3$ ,  $k_4$
  - Slow convergence
  - Sometimes unstable
- Simplified: Three parameter model (Lammertsma and Hume, 1996, Neuroimage)
  - $R_1 = K_1/K_1'$ ,  $k_2$  (or  $k_2^{app}$ ),  $BP_{ND}(k_3/k_4)$
  - Assumption: ND+S equilibrate rapidly (target ROI is 1 tissue comp. kinetics)

Roger Gunn







Assumption:  $\frac{K_1}{k_2} = \frac{K_1}{k_2}$  non specific binding the same  $k_2^{app} = \frac{k_2}{1 + BP_{ND}}$  rapid exchange in target tissue





### **Full Reference Tissue Model**

• Reference tissue: 
$$\frac{dC_{ND}(t)}{dt} = K_1'C_P(t) - k_2'C_{ND}(t)$$

$$\frac{dC_{FT}(t)}{dt} = K_1 C_P(t) - k_2 C_{FT}(t) - k_3 C_{FT}(t) + k_4 C_S(t)$$

• Target tissue:

$$\frac{dC_S(t)}{dt} = k_3 C_{FT}(t) - k_4 C_S(t)$$

- C<sub>FT</sub>(t) is the concentration time course of free ligand in tissue water
- $C_{S}(t)$  is the concentration time course of specific bound ligand in tissue
- $C_{ND}(t)$  is the concentration time course in the reference region
- K<sub>1</sub> is the influx rate constant from plasma
- k<sub>2</sub> is the efflux rate constant from the tissue
- k<sub>3</sub> is the influx rate constant to specific bound compartment
- k<sub>4</sub> is the efflux rate constant from specific bound compartment
- $R_1$  is the ratio of the delivery in the tissue region to the reference region
- Assumption:  $K_1/k_2 = K'_1/k'_2$

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# Simplified Reference Tissue Model

Reference tissue:  

$$\frac{dC_{ND}(t)}{dt} = K_1'C_p(t) - k_2'C_{ND}(t)$$
Target tissue:  

$$\frac{dC_{FT}(t)}{dt} = K_1C_p(t) - k_{2,app}C_{FT}(t)$$
Solution:  

$$C_T(t) = R_1C_{ND}(t) + \left(k_2 - \frac{R_1k_2}{1 + BP_{ND}}\right)C_{ND}(t) \otimes e^{\frac{-k_2}{1 + BP_{ND}}t}$$
Where:  

$$R_1 = K_1/K_{11}'BP_{ND} = k_2/(k_{41}k_2 a_{DD}) = k_2/(1 + BP_{ND})$$

 $R_1 = K_1/K_1, BP_{ND} = k_3/k_4, k_{2,app} = k_2/(1 + BP_{ND})$ 

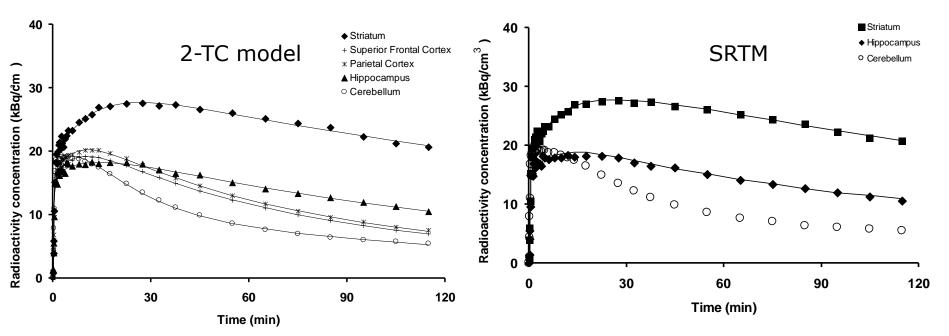
- $C_{FT}(t)$  is the concentration time course in the tissue (region of interest)
- $C_{ND}(t)$  is the concentration time course in the reference region
- $k_2$  is the efflux rate constant from the tissue
- $R_1$  is the ratio of the delivery in the tissue region to the reference region  $(K_{1/}K'_{1})$
- BP<sub>ND</sub> is the binding potential
- Assumption:  $K_1/k_2 = K'_1/k'_2$

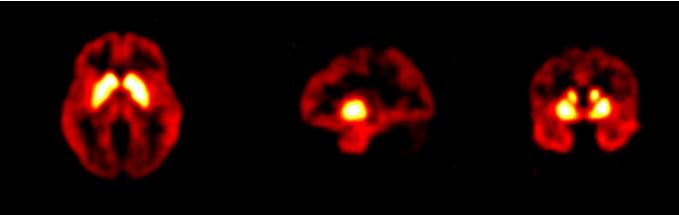
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Roger Gunn



#### Example: [<sup>11</sup>C]SB207145 imaging 5-HT<sub>4</sub> receptors



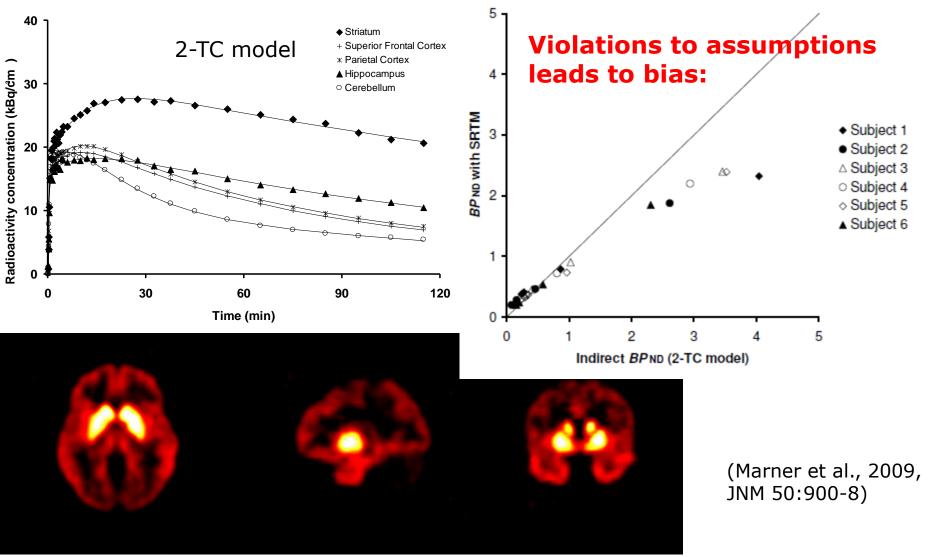


(Marner et al., 2009, JNM 50:900-8)





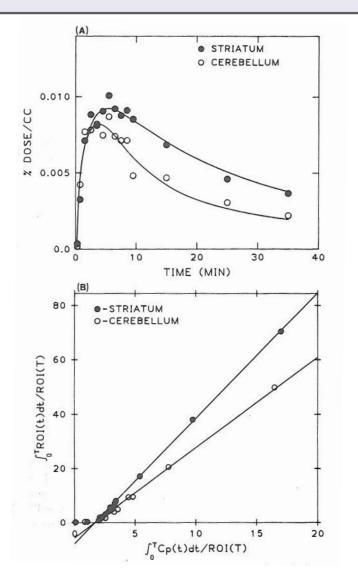
#### Example: [<sup>11</sup>C]SB207145 imaging 5-HT<sub>4</sub> receptors



Cimbi Center for Integrated molecular torain imaging



# Logan plot



Graphical analysis of reversible radioligand binding:

- At time t\*, the integrated tissue activity divided by the tissue activity as a function of the integrated plasma activity divided by the tissue activity becomes linear with the slope 1+BP<sub>P</sub>
- Plasma input can be substituted with the reference tissue input function

(Logan et al., 1990, JCBFM 10:740-7)





In comparison to Simplified Reference Tissue Model

- Advantage:
  - Fast linear calculation especially important for parametric images
- Limitation:
  - Dependence on choosing a proper  $t^*$
  - Noise-induced bias due to  $C_{\mathrm{T}}(\mathrm{T})$  on both sides of the equation
    - Overcome by the derivations by Ichise, of the MRTM and the MRTM2 with fixed  $k_2'$

SRTM has by Roger Gunn been implemented as linear fitting using a library of basic functions (basic pursuit functions), which also makes SRTM fast!





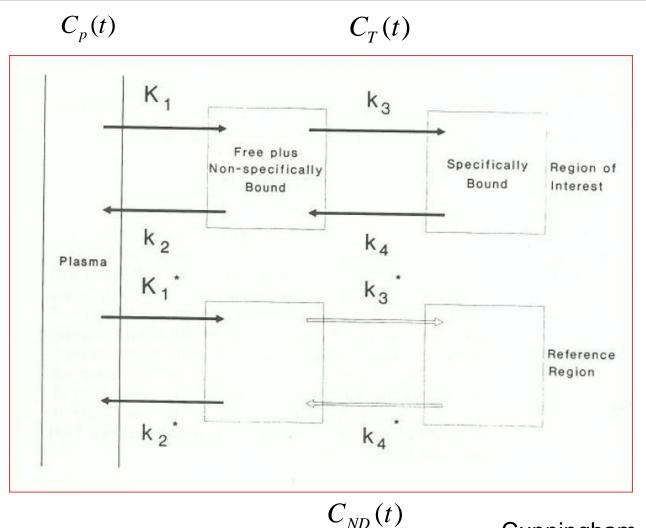
### **Overview of linearized models**

- Irreversible models
  - Patlak model (require arterial samples)
- Reversible models
  - Logan model (require arterial samples)
  - Logan reference model
  - Multilinear Reference tissue model (MRTM)





# **Model of receptor binding**



Cunningham et al., 1991, JCBFM



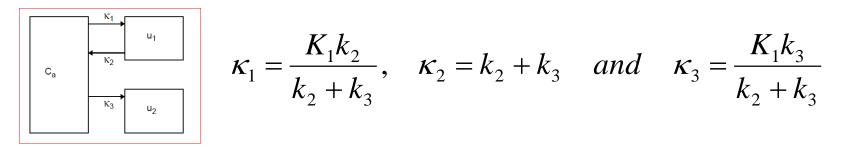


From page 45-48 in the Pharmacokinetic book (Blomquist):

• The solution to a two-tissue compartment model (FDG,  $K_4=0$ ) is:

$$\mathbf{C}_{\mathbf{P}} \xrightarrow{\mathbf{K}_{1}} \mathbf{C}_{1} \xrightarrow{\mathbf{k}_{3}} \mathbf{C}_{2} \qquad C_{T} = \frac{K_{1}}{k_{2} + k_{3}} \left( k_{2} e^{-(k_{2} + k_{3})t} + k_{3} \right) \otimes C_{P}$$

• From this analytic solution a two tissue compartment model can be written with the following rate constants:







• This can be written as the two differential equations:

$$\frac{du_1}{dt} = \kappa_1 C_P - \kappa_2 u_1 \quad and \quad \frac{du_2}{dt} = \kappa_3 C_P$$

• Linearization of this leads to the following equations:

$$u_1 = \kappa_1 \int_0^t C_P d\tau - \kappa_2 \int_0^t u_1 d\tau$$
$$u_2 = \kappa_3 \int_0^t C_P d\tau$$

• The measured signal from the brain scanner is:

$$C_T = u_1 + u_2$$



Ca

к3



• From the late time points (stable) where  $\frac{du_1}{dt}$  can be assumed to be close to zero, we get the following approximation (Patlak-Gjedde):

$$0 = \kappa_1 C_p - \kappa_2 u_1 \to u_1 = \frac{\kappa_1}{\kappa_2} C_P$$

• and therefore by substituting:

$$C_T = \frac{\kappa_1}{\kappa_2} C_P + \kappa_3 \int_0^t C_P \, d\tau$$

• which by dividing by C<sub>P</sub> gives (Patlak plot):

$$\frac{C_T}{C_P} = \frac{\kappa_1}{\kappa_2} + \kappa_3 \frac{\int\limits_0^t C_P \, d\tau}{C_P}$$





- From the fitted line we therefore have:
  - The metabolic rate  $K_i = \frac{K_1 k_3}{k_2 + k_3}$  is therefore the same as the slope  $\kappa_3$
  - The distribution volume  $V_T = \frac{K_1 k_2}{(k_2 + k_3)^2}$  is therefore the same as the intercept  $\kappa_1/\kappa_2$

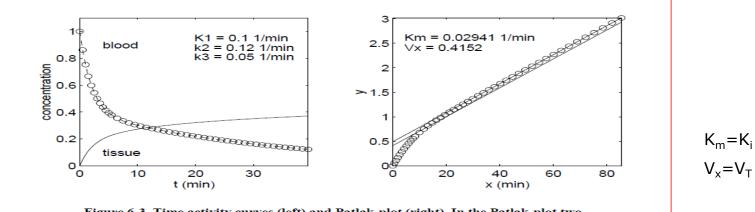


Figure 6-3. Time activity curves (left) and Patlak-plot (right). In the Patlak-plot two straight lines are indicated. The first one results from a least squares fit to the linear portion of the data points. The second one is the straight line expected from Eq. (6.16). The shift of the data points relative to the theoretically expected behaviour is explained by the rather rapid variations of  $c_a$  during the late phase.

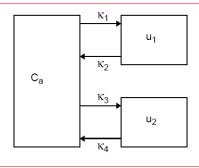
Pharmacokinetic book, p 48





# Logan plot (reversible model)

- From page 49-50 in the Pharmacokinetic book:
- For a decoupled two-tissue compartment model:



$$\frac{du_{1}}{dt} = C_{P}\kappa_{1} - u_{1}\kappa_{2 \text{ and }}\frac{du_{2}}{dt} = C_{P}\kappa_{3} - u_{2}\kappa_{4}$$
$$C_{T} = u_{1} + u_{2} = \kappa_{1}e^{-\kappa_{2}t} + \kappa_{3}e^{-\kappa_{4}t}$$
$$C_{a} = C_{P}$$

• If k<sub>4</sub> is large (reversible system) the decoupled constants can be approximated as:

$$\kappa_1 = K_1, \kappa_2 = \frac{k_2 k_4}{k_2 + k_3 + k_4}$$
$$\kappa_4 = (k_2 + k_3 + k_4) - \kappa_2$$

 In the case with a high k<sub>4</sub> the concentration in u<sub>2</sub> approaches zero, and the total system response is approximately coming from u<sub>1</sub>





# Logan plot (reversible model)

• The system can therefore be approximated by:

$$\frac{dC_T}{dt} = \kappa_1 C_P - \kappa_2 C_T$$

 And in this case the distribution volume can be calculated as (k<sub>4</sub> assumed to be much larger than k<sub>2</sub>):

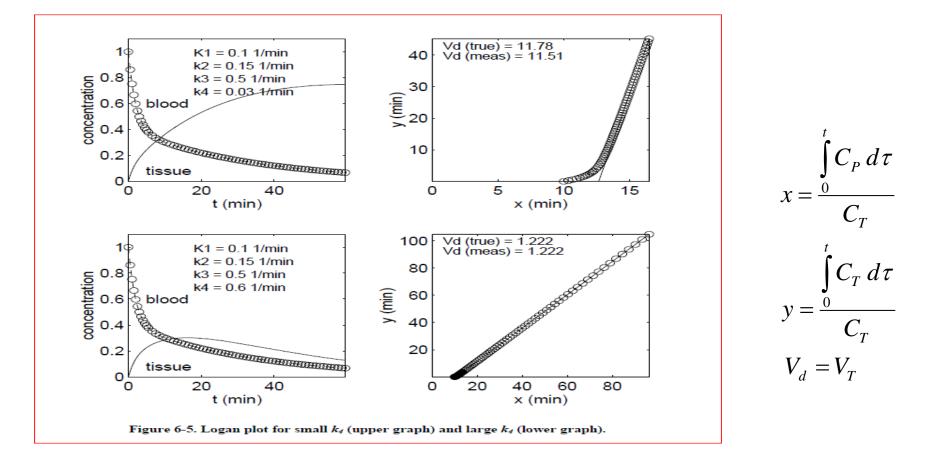
$$V_T = \frac{\kappa_1}{\kappa_2} \approx \frac{K_1}{k_2} \frac{k_3 + k_4}{k_4}$$

- Linearization in the Logan approximation therefore gives:  $C_T = \kappa_1 \int_0^t C_P d\tau - \kappa_2 \int_0^t C_T d\tau$   $\frac{\int_0^t C_T d\tau}{C_T} = -\frac{1}{\kappa_2} + V_T \frac{\int_0^t C_P d\tau}{C_T}$
- The slope of the fitted line therefore describe the distribution volume,  $V_T$ .





# Logan plot (reversible model)



Pharmacokinetic book, p 51





# Logan reference plot (reversible model)

- The linearized equation for the Logan model with plasma input is:
- With a reference region we have:
- And substituting this into the first equations we get:
- Estimation of k'<sub>2</sub> has to come from another method, or a population based value

$$\frac{\int_{0}^{T} C_{T}(t)dt}{C_{T}(t)} = DV \frac{\int_{0}^{T} C_{p}(t)dt}{C_{T}(t)} + b$$
  
with  $DV = 1 + BP_{p}$   $DV = V_{T}$ 

$$\frac{dC_{ND}(t)}{dt} = K_1 C_p(t) - k_2 C_{ND}(t)$$

$$\int_0^T C_p(t) dt = \frac{1}{\lambda} \left[ \int_0^T C_{ND}(t) dt + \frac{C_{ND}(t)}{k_2} \right]$$
with  $\lambda = K_1 / k_2$ 

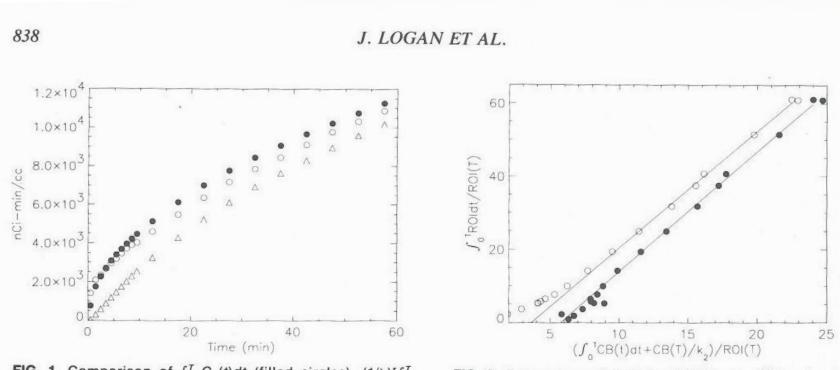
$$\frac{\int_{0}^{T} C_{T}(t)dt}{C_{T}(t)} = DVR \frac{\int_{0}^{T} C_{ND}(t)dt + \frac{C_{ND}(t)}{k_{2}'}}{C_{T}(t)} + b$$
  
with  $DVR = DV / \lambda$   
 $DVR = \frac{V_{T}}{V_{T}'}$ 

Logan et al., 1996, JCBFM 16(5):834-40





#### Logan reference plot (reversible model)



**FIG. 1.** Comparison of  $\int_0^T C_p(t)dt$  (filled circles),  $(1/\lambda)[\int_0^T CB(t)dt + CB(T)/\overline{k_2}]$  (open circles), and  $(1/\lambda)\int_0^T CB(t)dt$  (triangles) for raclopride ( $\lambda = 0.418$  was determined graphically using the measured plasma input function).

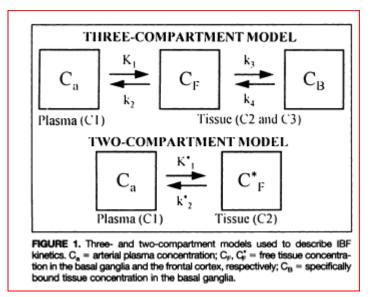
**FIG. 3.** Comparison of DVR for BG/CB of a [<sup>11</sup>C]raclopride study,  $\overline{k}_2 = 0.163$  (filled circles, DVR = 3.24), and DVR calculated using Eq. 7 so that CB(T)/ $\overline{k}_2$  was not included (open circles, DVR = 3.17). For comparison, DVR with plasma is 3.25. See text for abbreviations.

Logan et al., 1996, JCBFM 16(5):834-40

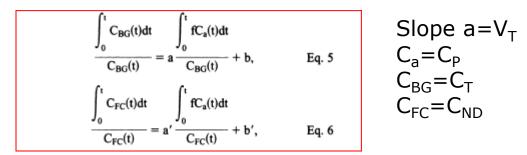




From Ichise et al., 1996, JCBFM:



Linearization of both tissue and ref tissue models separately:







#### **MRTM**<sub>O</sub>

**MRTM** 

$$\frac{\int_{0}^{t} C_{\mathrm{T}}(t) dt}{C_{\mathrm{T}}(t)} = \frac{V_{\mathrm{T}}}{V_{\mathrm{T}}'} \frac{\int_{0}^{t} C_{\mathrm{T}}'(t) dt}{C_{T}(t)} + \frac{V_{\mathrm{T}}}{V_{\mathrm{T}}' k_{2}'} \frac{C_{T}'(t)}{C_{T}(t)} + b$$

$$BP_{\mathrm{ND}} = \frac{V_{\mathrm{T}}}{V_{\mathrm{T}}'} - 1 = \gamma_{1} - 1$$

Ichise et al., 1996, JCBFM

1T tracers: t > 02T tracers:  $t > t^*$ 

#### Ichise et al., 2002, JCBFM

•Improvement to noise:

- $\bullet C_{\mathsf{T}}$  is no longer present in independent variables
- •Correlation between noise in dependent and independent variables reduced

$$C(T) = -\frac{V}{V'b} \int_{0}^{T} C'(t)dt + \frac{1}{b} \int_{0}^{T} C(t)dt - \frac{V}{V'k_{2}'b}C'(T)$$

$$2T \text{ tracers: } t > t^{*}$$

$$BP_{ND} = -(\gamma_{1}/\gamma_{2} + 1)$$

$$C(T) = R_{1}k_{2}' \int_{0}^{T} C'(t)dt - k_{2} \int_{0}^{T} C(t)dt + R_{1}C'(T)$$

$$T \text{ tracers: } t > 0$$

$$BP_{ND} = -(\gamma_{1}/\gamma_{2} + 1)$$

$$R_{1} = \gamma_{3}$$

$$k_{2}' = \gamma_{1}/\gamma_{3}$$

 $\gamma$ 's: regression coefficients





#### MRTM2

#### Ichise et al., 2003, JCBFM

In MRTM  $k'_2$  is estimated independtly for each voxel, but there is only one reference region, so to take care of that it could be fixed to a common value and the equations reduces to:

