

## Biomarkers - Oncology and Inflammation

**Markus Rudin**

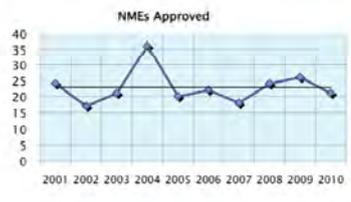
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## Issues with drug discovery

### Ten Year Average NME\* Approvals Per Year



Calendar Year	NMEs Approved
2001	24
2002	17
2003	21
2004	36
2005	20
2006	22
2007	18
2008	24
2009	26
2010	21

[www.fda.gov](http://www.fda.gov)

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## biomarkers - imaging



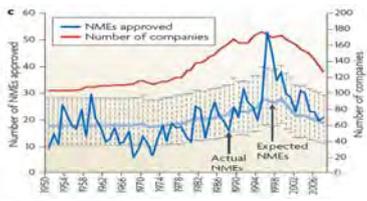
U.S. DEPARTMENT OF HEALTH AND HUMAN SERVICES  
U.S. FOOD AND DRUG ADMINISTRATION

FY 2011 Innovative Drug Approvals

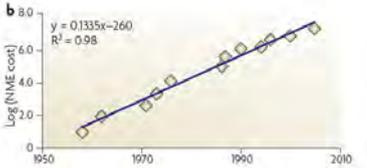
EXECUTIVE SUMMARY	
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NOTABLE FY 2011 APPROVALS	6
A. Cancer	8
1. Dostar	8
2. Otilofab	9
3. Fufuroil	11
4. Yervoy	12
5. Adaverts	13
6. Capivas	14
7. Rilovon	15
8. Naproxcin C	16
9. Victrolis	16
10. Dacthok	16
11. Lemp / Benlita	17
12. Heart Attack and Stroke	18
13. Prokiva	18
14. Brilinta	18
15. MIRA Infections / Telam	19
16. Kidney Transplant Rejection / Malsip	20
17. Hemorrhagic Anemia (HAE) / Fovorr	20
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## Issues with drug discovery



Constant output in NMEs



Exponential growth of R&D expenditures

Munos et al. Nat Rev Drug Disc (2009)

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## Issues with drug discovery

According to the latest annual review of pharma R&D value by Deloitte and Thomson Reuters, *Measuring the Return from Innovation*, the average cost of bringing a new product successfully to market among the top 12 research-based pharmaceutical companies worldwide increased by 26.3% from US\$830 million in 2010 to US\$1,048 million in 2011.

Over the same period, the number of late-stage compounds in development dropped from 23 on average per company to 18 per company. Moreover, the average R&D Internal Rate of Return (IRR) among the companies analysed was down from 11.8% in 2010 to 8.4% this year

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## Issues with drug discovery

### The Critical Path Initiative

*to 'ensure that basic scientific discoveries translate more rapidly into new and better medical treatment by creating new tools to find answers of how the safety and efficacy of new medical products can be demonstrated in faster time frames, with more certainty, at lower cost and with better information'*

[<http://www.fda.gov>].

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### CPI - biomarkers

**critical Path Initiative (FDA) / Innovative Medicine Initiative (EMA)**

**clinical endpoint**      how a patient feels, functions or survives

**biomarker**              objective measurement associated with pathological process /therapeutic intervention with prognostic quality

**surrogate**                validated biomarker that substitutes for a clinical endpoint

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### biomarkers - imaging

**biomarkers should be**

- non-invasive
- should allow for follow-up studies
- focal
- simple
- low-cost

➡ **non-invasive imaging** providing

- morphological
- physiological
- metabolic
- cellular
- molecular

    } readouts in temporo-spatially resolved manner

➔ **potential biomarkers** for patient staging / stratification, proof of mechanism and therapeutic efficacy

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### multimodal imaging inherently translational

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### optimal method depends on question to be answered

- ➔ **molecular constituents:** e.g. receptor expression
  - ➔sensitivity (low concentrations)
  - ➔specificity (minimal cross-contamination of signals)
  - ➔spatial resolution
  - ➔temporal resolution
- ➔ **physiology:** e.g. tumor perfusion
  - ➔temporal resolution (analysis of bolus passage)
  - ➔spatial resolution
  - ➔sensitivity
- ➔ **morphology:** e.g. volume, shape, heterogeneity
  - ➔spatial resolution
  - ➔high soft-tissue contrast
  - ➔sensitivity
  - ➔temporal resolution

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### tumor: structural imaging

M Dominietto IBT (UZH/ETH)

detection of space occupying lesions (native contrast or contrast enhancement)

staging – texture / heterogeneity, infiltration of adjacent tissue, tumor volume

therapy assessment – RECIST (response criteria of solid tumors)

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### therapy effect on tumor volume

effect of octreotide treatment on hormone dependent tumors expressing SST receptors

estradiol induced pituitary hyperplasia

Rudin et al. MRM (1986)

Dunning R3227-H prostate tumor

Siegel et al. Cancer Res (1986)

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### information from imaging data

- molecular imaging**
  - drug biodistribution
  - target expression
  - receptor occupancy
  - signaling pathways
- structural imaging**
  - in vivo morphometry
  - in vivo morphology
  - disease phenotyping/dx
- functional imaging**
  - physiological measurements
  - functional MRI
  - functional receptor imaging
- cellular imaging**
  - cell migration & fate
  - cell therapies

system response

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### the hallmarks of cancer (1st generation)

- Sustaining proliferative signaling
- Evading growth suppressors
- Activating invasion and metastasis
- Enabling replicative immortality
- Inducing angiogenesis
- Resisting cell death

Hanahan & Weinberg, Cell 144, 694 (2011) rudin - wmic dublin - 05092012 14

### intracellular signaling networks in cancer

Hanahan & Weinberg, Cell 144, 694 (2011) rudin - wmic dublin - 05092012 15

### intracellular signaling networks in cancer

Hanahan & Weinberg, Cell 144, 694 (2011) rudin - wmic dublin - 05092012 16

### the hallmarks of cancer (2nd generation)

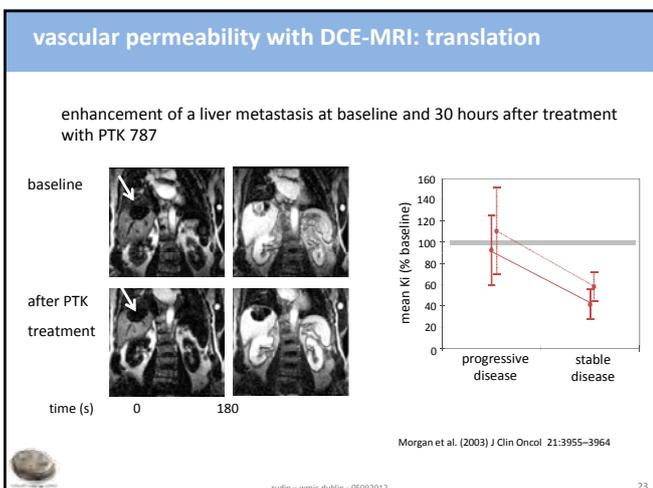
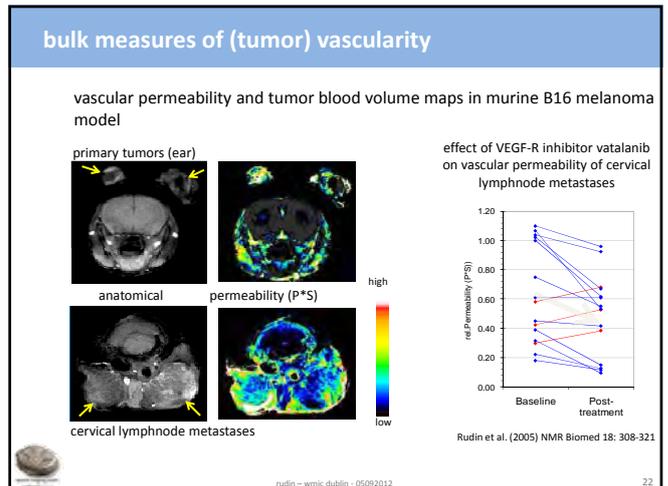
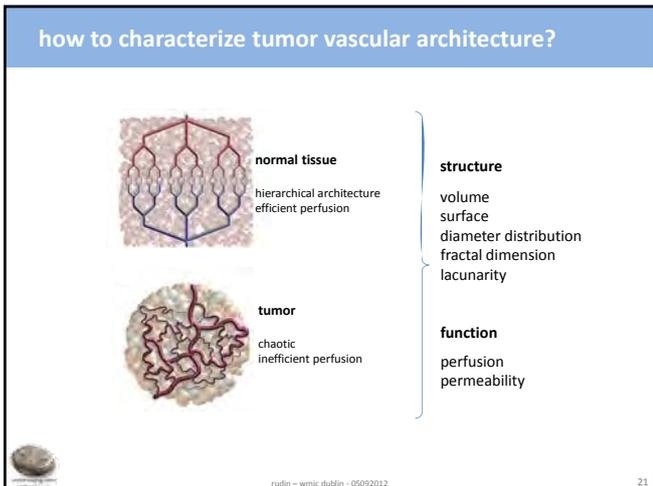
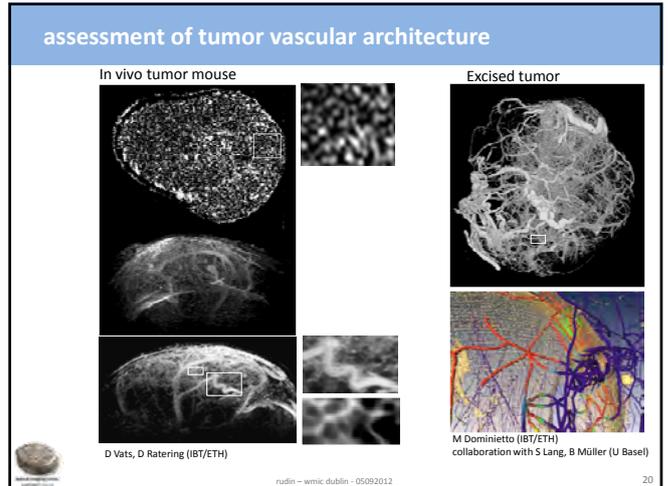
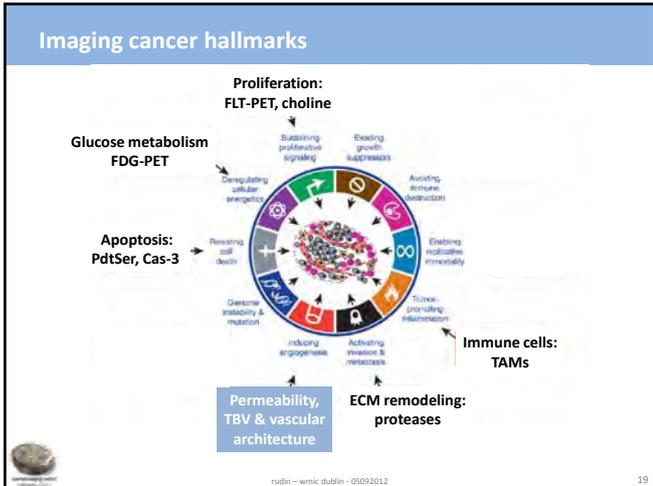
- Deregulating cellular energetics
- Genome instability and mutation
- Enabling Characteristics
- Tumor-promoting inflammation
- Avoiding immune destruction

Hanahan & Weinberg, Cell 144, 694 (2011) rudin - wmic dublin - 05092012 17

### the hallmarks of cancer (2nd generation)

- EGFR inhibitors
- Cyclin-dependent kinase inhibitors
- Immune activating anti-CTLA4 mAb
- Telomerase inhibitors
- Selective anti-inflammatory drugs
- Inhibitors of HDACs/MeT
- Inhibitors of VEGF signaling
- PARP inhibitors
- Proapoptotic Bcl2 mimetics
- Aerobic glycolysis inhibitors

Hanahan & Weinberg, Cell 144, 694 (2011) rudin - wmic dublin - 05092012 18



### vascular permeability biomarker - issues

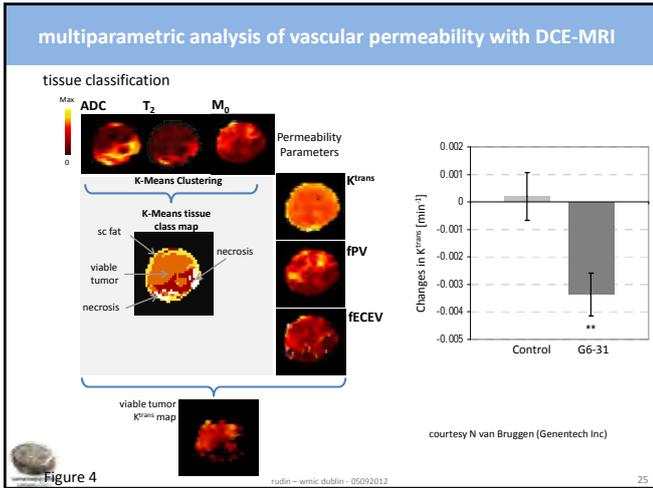
approved CA (GdDTPA's) small hydrodynamic radius → highly leaky → reduced dynamic range

- novel CAs: larger hydrodynamic radius

tumor heterogeneity not accounted for by conventional analysis

- tissue classification (e.g. based on multiparametric MRI readouts)
- pattern analysis techniques

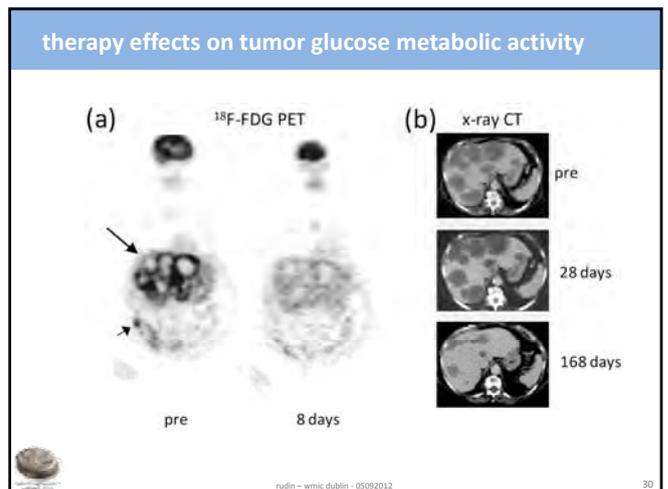
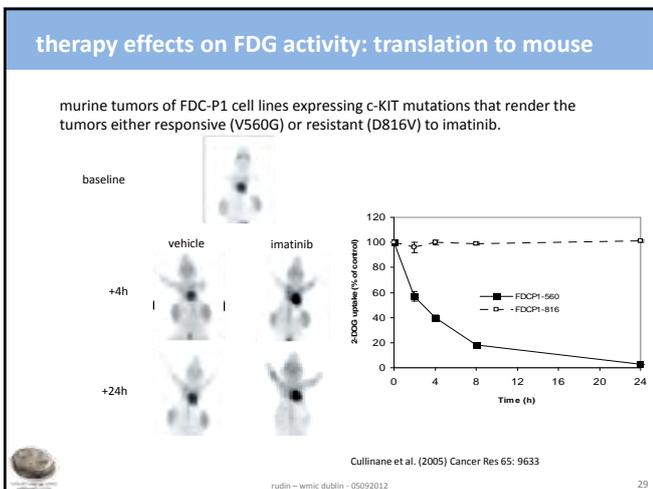
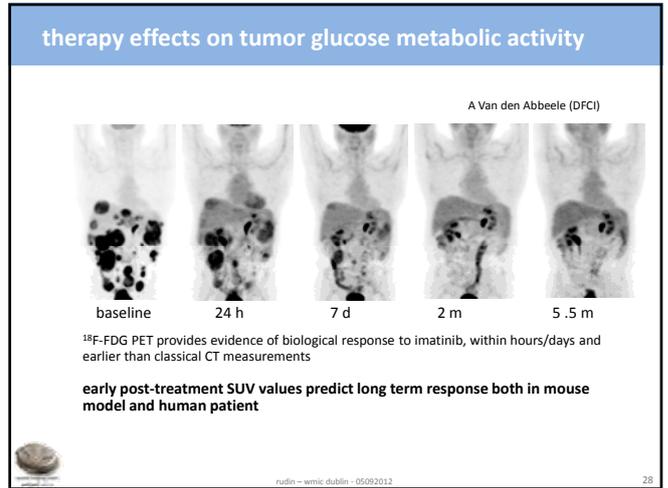
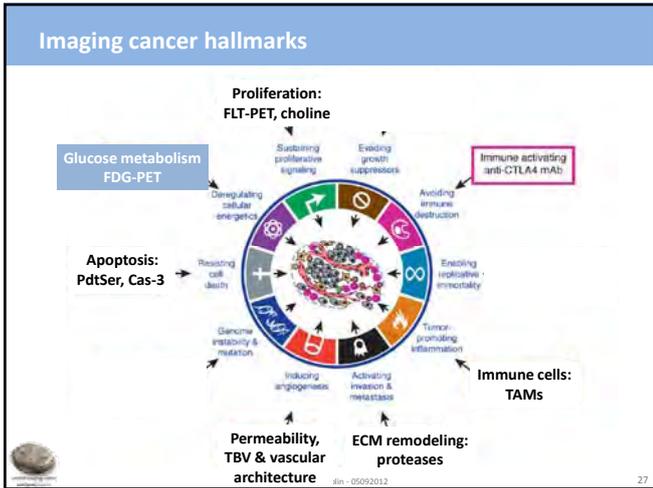
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### multimodal imaging of angiogenesis: parameters/modeling

parameter	biological information	mod	process
vascular permeability	sites of angiogenesis	MRI	angiogenic ,endpoint': vessel morphology and physiology
tumor blood volume	total vascularization	MRI	
TBV and vessel size	vascular architecture	MRI	
hypoxia	tumor oxygenation	PET	angiogenic signaling
HIF1a and HIF activity	hypoxia signaling	OPT	
VEGF	proangiogenic signaling	OPT	
adhesion molecules	activated endothelium	OPT	tumor-host tissue interaction
proteases	ECM degradation	OPT	
inflammatory cells	Immune response / ECM degradation	MRI	

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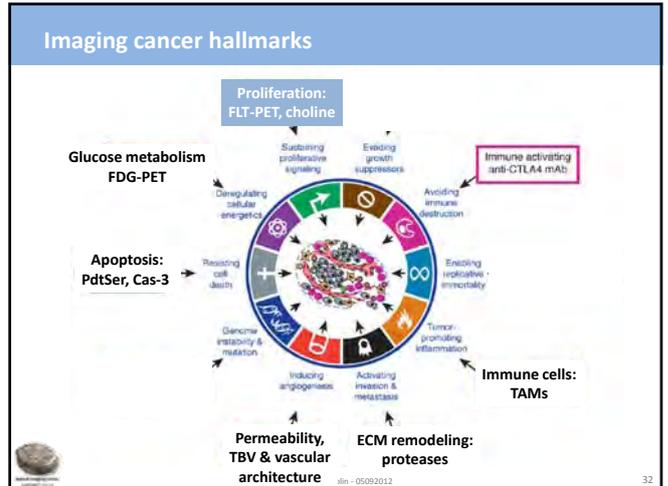
### therapy effects on tumor glucose metabolic activity

clinical efficacy of PLX4032 (RG7204), a potent inhibitor of oncogenic B-RAF kinase activity, in patients with *BRAF*-mutant melanoma

**Patient 45**      **Patient 59**

G Bollag, et al. (2010) Nature 467: 596-599

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### comparison FDG- versus FLT-PET for tumor detection

lymphoma

Buck AK et al, Cancer Res 2006;66:11055-11061

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### comparison FDG- versus FLT-PET for tumor detection

Glioblastoma multiformae

MPI Cologne, Germany

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### potential tumor therapy MRI biomarker

- DCE-MRI: alterations in vascular permeability → angiogenesis
- ADC mapping: changes in water diffusivity – cellularity / apoptosis
  - Moffat BA et al. (2005) PNAS 102: 5524-9  
Functional diffusion map: A noninvasive MRI biomarker for early stratification of clinical brain tumor response.
  - Khayal IS et al (2010) NeuroOncology 12: 908-16  
Evaluation of diffusion parameters as early biomarkers of disease progression in glioblastoma multiforme'
- MRS: effects on tumor glucose or lipid metabolism
  - Gallagher FA et al. (2009) PNAS 106: 19801-4  
Production of hyperpolarized [1,4-<sup>13</sup>C]malate from [1,4-<sup>13</sup>C]fumarate is a marker of cell necrosis and treatment response in tumors

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### deriving quantitative data from imaging data sets

how to translate imaging information into meaningful biological information?

- morphometric analysis
- densitometric analysis

- 1) translate intensity into concentration
  - PET: activity
  - MRI: relaxivity change
  - FMT: intensity $\propto$  amount of tracer in voxel: weighted sum of all compartments
- 2) correct for confounding contributions (scattering, absorption, transport/diffusion, chemical exchange/metabolism, bleaching,...)
- 3) dynamic modeling of concentrations in individual compartments
- 4) relate model parameters to biological process

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### Robustness / reproducibility of measurement

Estimates of various error sources

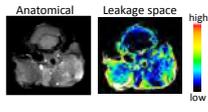
- a) Experimental**
  - Instrumental**: phantom studies
  - Biological**: intraindividual, Interindividual
  - Procedural**: reproducibility of procedures, automated procedures
- b) Data Analysis**: automated using validated procedures, semiautomated, operator-interactive



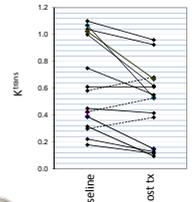
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### Robustness / reproducibility of measurement

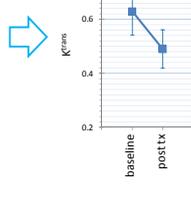
**B16 melanomas: cervical lymphnode metastases**



**cross-sectional**



**longitudinal relative to baseline**





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### deriving concentrations from signal intensities: PET

Local activity proportional to local concentration of radioisotope

$$Q(\vec{r}) = -\frac{dN(\vec{r})}{dt} = \lambda \cdot N(\vec{r})$$

Injected dose per gram of tissue: %ID/g

$$\%ID/g = \frac{c_i \cdot v_i}{D_{inj} \cdot m_i} \cdot 100\%$$

Standardized uptake value: SUV

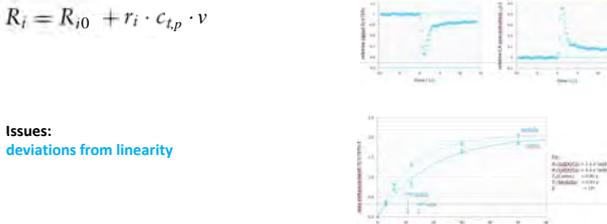
$$SUV = [\%ID/g] \cdot M / 100 = \frac{c_i \cdot v_i}{D_{inj} \cdot m_i} \cdot M$$

$$SUV' = [\%ID/g] \cdot S / 100 = \frac{c_i \cdot v_i}{D_{inj} \cdot m_i} \cdot S$$


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### deriving concentrations from signal intensities: MRI

Assumption: relaxivity depends linearly on amount of tracer in voxel

$$R_i = R_{i0} + r_i \cdot c_{t,p} \cdot v$$


Issues: deviations from linearity

mixed contrast e.g. R<sub>1</sub> & R<sub>2</sub> (ambiguities)




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### Receptor affinity from concentrations

Receptor Binding

Receptor Binding:  $L + R \leftrightarrow RL$

Equilibrium constant:  $K_d = \frac{k_{off}}{k_{on}} = \frac{[L] \cdot [R]}{[RL]}$

(principle of microreversibility):  $k_{off} \cdot [RL] = k_{on} \cdot [R] \cdot [L]$

Mass conservation for receptor:  $[R_T] = [R] + [RL]$

yields

or the Scatchard equation:  $\frac{[RL]}{[L]} = -\frac{1}{K_d} \cdot [RL] + \frac{[R_T]}{K_d}$



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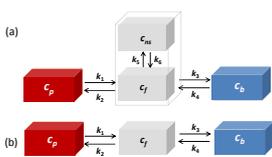
### Imaging yields concentration in a voxel

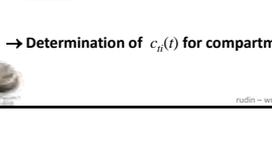
Voxel comprises multiple compartments, therefore c<sub>i</sub>(t) corresponds to volume averaged concentration of CA across these compartments, i.e.

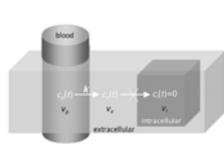
$$c_i(t) = \frac{1}{V} \sum_i v_i \cdot c_{i,t}(t)$$

Multicompartment models to deconvolve individual contributions

(a)







→ Determination of c<sub>i</sub>(t) for compartment of interest



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### physiological modeling

deformation stress → proliferation/apoptosis → nutrients  $O_2$  → hypoxia → TAF

blood flow:  $O_2$  & nutrient transport

angiogenic gradient remodeling

$$\frac{\partial n}{\partial t} = \nabla_{\vec{x}} \cdot \vec{V} n + P_{\vec{x}} - A_{\vec{x}}(n)$$

$$\frac{\partial v}{\partial t} = S_{\vec{x}} + \nabla_{\vec{x}} \cdot \vec{V} v_{\vec{x}} - \phi_{\vec{x}} v_{\vec{x}}$$

dynamic modeling of vessel formation

$O_2$  concentration  $c_{O_2}(t)$  through tumor slice

tumor volume & vessel growth at time  $t$

TAF concentration  $c_{TAF}(t)$  through tumor slice

vessel size images

experiment      model

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### biomarkers: facilitating transition from discovery to clinics?

today there are only few examples of using imaging information to facilitate the translation from mouse to man

- too early to tell
- technical issues: tools used for mouse imaging not appropriate for clinical setting
  - not approved
  - not standardized (i.e. not suited for multi-center trials)
  - not properly validated
  - not quantitative
  - ...
- perceived issues: e.g. acceptance/expectations by drug developer
- a mouse is a model for man – not man!

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### translational biomarkers – a multimodality approach

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