

MATHEMATICAL ONCOLOGY ALEXANDER ANDERSON, PHD MOFFITT CANCER CENTER

March 31, 2023

Endorsed by



INTERNATIONAL ASSOCIATION FOR THE STUDY OF LUNG CANCER Conquering Thoracic Cancers Worldwide Accredited by





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@ARA ANDERSON



Alexander R. A. Anderson Integrated Mathematical Oncology Moffitt

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Integrated Mathematical Oncology



Unified goal: To better understand, predict and treat cancer



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Integrated Mathematical Oncology

I AM A MODELER: Make predictions Answer questions Generate hypothesis YOU ARE A MODELER: •Biological (e.g. Cell culture) Mathematical (e.g. Differential equations) Clinical (e.g. Imaging)



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Integrated Mathematical Oncology

Preclinical = Homogeneity Experimental systems: in vitro & in vivo Error bars should minimized Reproducibility is central to research **Clinical = Heterogeneity** Within individual tumours Across patients with the same cancer •Diversity in age, stage, health & history etc



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ATLANTIC HURRICANE TRACKS



PREDICT THE FUTURE

20

NICARAGUA

BERMUDA

MATHEMATICAL MODELS CAN

CIMC

PUERTO RICO

ADVANCES IN TREATMENT SCHEDULING

- Over the last 60 years treatment scheduling has evolved significantly
- You might not know that mathematical modeling played an important role in much of it
- With ever increasing drug options, dosing, timing and combination needs modeling more than ever.



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MAXIMUM TOLERATED DOSE THERAPIES FAIL BECAUSE OF RESISTANCE





Sandy Anderson



Bob Gatenby



"To develop and deploy the next generation of truly personalized cancer therapy, through the integration of predictive mathematical models, patient data and evolutionary principles"

Solutionary Otherapy



PRINCIPLES OF ADAPTIVE THERAPY

MTD Sensitive Resistant MED

Evolution of resistance is inevitable with MTD



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Sensitive cells suppress growth of resistant clones



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RESISTANCE MAY HAVE A COST



Different cell lines exhibit different costs of resistance



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ADAPTIVE PROSTATE CANCER TRIAL (NCT02415621)

If response exceeds >50% reduction in PSA, withdraw therapy until PSA reaches pre-treatment level





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ABIRATERONE TRIAL RESULTS

- Improved median TTP (33.5 months) and median OS (58.5 months) (Hazard ratio, 0.20)
- Subjects received no abiraterone during 46% of time on trial
- 4 patients remain on trial with stably cycling disease (53-70 months)



Nat Comms. 2017, doi.org/10.1038/s41467-017-01968-5





Trial Cohort ■ Off Abiraterone On Abiraterone \times Scan Progression 2 3 5 4 Years **Contemporaneous Cohort** 0005 0007 0008 00140012Off AbirateroneOn Abiraterone × Scan Progression 70 0002 2 3 5 Years





EVOLUTIONARY CLINICAL TRIALS

| NCI TRIAL | | TITLE |
|------------|----|--|
| NCT0565182 | 28 | Adaptive vismodegib in advanced basal ce |
| NCT051894 | 57 | 1st Strike, 2nd Strike Therapies for High Ri |
| NCT0241562 | 21 | Adaptive Abiraterone Therapy for Metastati |
| NCT0351119 | 96 | Intermittent Androgen Deprivation Therapy |
| NCT0354396 | 69 | Adaptive BRAF-MEK Inhibitor Therapy for A |
| NCT0438883 | 39 | Evolutionary Therapy for Rhabdomyosarco |
| NCT0434336 | 65 | Generating Novel Therapeutic Strategies B |



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Il carcinoma

isk Metastatic Castration Sensitive Prostate Cancer

ic Castration Resistant Prostate Cancer

for Stage IV Castration Sensitive Prostate Cancer

Advanced BRAF Mutant Melanoma

oma

Based on Evolutionary Tumor Board





EVOLUTIONARY TUMOR BOARD (ETB)



Past Tx and responses abstracted

Clinical trial to implement the ETB (NCT04343365)

- Different patients from different cancers every month \bullet
- Pre-board discussion with IMO 1-2 weeks before ETB \bullet
- Multi-model approach driven by eco-evolutionary principles
- Integrated decision making process



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Christine Chung



Damon Reed













PATIENT ETB-003 (HEAD AND NECK)

$$\begin{split} \dot{T}_{i} &= \begin{pmatrix} Growth \\ \hat{\gamma}_{i} \end{pmatrix} - \underbrace{\sum_{j} \delta_{j} E_{j} D_{j}}_{j} \end{pmatrix} T_{i} \\ \dot{E}_{j} &= \begin{pmatrix} \underbrace{Sensitization}_{s_{j}(1 - E_{j})(1 - D_{j})} - \underbrace{Resistance}_{r_{j}D_{j}} \end{pmatrix} E_{j} \\ D_{j} &= D_{j}(t) \end{split}$$

Approach

- Fit base growth rate (γ_i) from target lesions •
- Drug efficacy (∂_i) fit under therapy •
- Rate of resistance (r_i) fit in combo with efficacy ۲
- Resensitization rates (s_i) will mostly come from historical data •



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HISTORICAL PATIENTS CONSTRAIN MODEL

Approach

- Retrospectively apply ETB workflow to historical cohorts in the same disease
- Collect parameter ranges for growth rates, drug efficacy, rates of resistance and sensitization
- Use these ranges prospectively for new patients on the ETB



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PHASE I TRIALS

- Phase I for imaginary number \bullet
- Use historic trial data
- Calibrate model to outcomes
- Uses Kaplan-Meier & waterfall plots
- Generate a Cohort of virtual patients
- Captures uncertainty
- Ideal for testing & optimization

Kim E. et al. Eur J Cancer. 2016 Nov;67:213-222. doi: 10.1016/j.ejca.2016.07.024.



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Virtual trials in virtual patients

Is this how we will accelerate progress in personalised treatments?







DECISION SUPPORT FOR ALL THERAPIES

- Comparison of different therapies based on historical precedent can suggest outcome ranges
- In this case, both chemotherapy options are not expected to improve outcomes over continuation of targeted therapy
- After third scan, despite continued response, model suggests switching to chemotherapy soon

MedRxiv 2023, doi: 10.1101/2023.01.18.23284628

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CONCLUSIONS

- Treatment selects for resistant phenotypes
- Timing matters but so does space
- Smart sequential therapies can exploit evolution
- Resistant phenotypes may have a cost
- Dynamic measures of burden are critical
- Patients should be their own control
- Evolutionary therapies: new use for old drugs



Jill Gallaher



Mark Robertson-Tessi



Robert Gatenby



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Joel Brown



Damon Reed



Christine Chung



PSOC CSBC



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"In the long history of humankind those who learned to collaborate and improvise most effectively have prevailed"

