

# Finding The Right Metrics For Evaluating Big Science

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  - “Waiting for the moonshot”
- Especially for Big Science programs
- Are mid-term assessments feasible?

# RESEARCH-TO-PRACTICE MILESTONES FOR GLEEVEC®

For more information on the supporting evidence and research sponsors for the following milestones, see the Web appendix table.

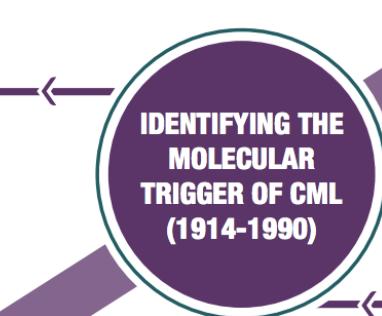
NCI researchers determined that ABL1, a gene that was known to be involved in some cancers, was altered by the chromosomal translocation.<sup>12,13</sup> NIH

1983-1984  
The cause of the abnormal Philadelphia chromosome – a chromosomal translocation – was identified.<sup>11</sup>

1960  
The altered chromosome in CML cancer cells was discovered and named the “Philadelphia chromosome,” after the city in which it was discovered.<sup>10</sup> NIH

1950s  
New scientific techniques helped researchers link chromosomal abnormalities to specific diseases.<sup>9</sup>

## IDENTIFYING THE MOLECULAR TRIGGER OF CML (1914-1990)



Biologist Theodor Boveri first had the idea that chromosomal abnormalities might play a role in tumor development, but no tools existed at that time to test his hypothesis.<sup>6</sup>

1990  
NIH-funded researcher Dr. Brian Druker began developing model systems to study BCR-ABL kinase signaling and explore ways to inhibit it.<sup>15</sup> NIH

1992  
Imatinib, the compound that would become Gleevec®, was first created, as part of a larger collection of compounds to test.<sup>17</sup>

Scientists at the pharmaceutical company Ciba-Geigy (which later became Novartis) started to refine a compound that blocks the actions of the BCR-ABL kinase.<sup>16</sup>

## DEVELOPING A TARGETED BCR-ABL KINASE INHIBITOR (1990-1996)

The Food and Drug Administration Modernization Act<sup>20</sup> allowed the FDA to create a “Fast Track” mechanism that makes important new drugs available to patients more quickly.<sup>21</sup>

1996  
Imatinib (Gleevec®) was shown to kill cancerous cells without harming healthy ones by blocking BCR-ABL kinase signaling.<sup>19</sup> NIH

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- Research funding ultimately a congressional responsibility
- Members of Congress motivated by “electoral connection,” incentive to direct funding to constituents
  - Politics of the pork barrel: bias to majority, institutional power
- Hypotheses:
  - Success at selling science (persuade MCs to keep hands off) contingent on ability to distinguish good science from bad
  - Cross-agency variation in political influence explained by differences in ability to distinguish, not geographic scope of work

# What Do Program Directors/Officers Think?

- Consistently supportive of the need to measure longer-term impact and the need to develop a better system for doing so
- ...greatest challenge in measuring the impact of funded science?
  - “We have the wrong metrics and the timeline is too long.”
- ...considering the impact or “success” of funded projects, do you make distinctions between short-, medium-, and long-term impacts?
  - “Yes. The challenge is that NASA Science is looking at the longer term. Decision makers often are not.”
- ...useful to think about assessing the impact of research at different stages of development?
  - “Yes, but right now decisions are made based on informed opinion rather than data”

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  - First-order empirical question

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  - First-order empirical question
- Second task: understand how an approach will influence the grant-making process
  - Characterize incentive to game the assessment process

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- Solve for outcomes using Perfect Bayesian Equilibrium

# Types of Waypoints

Accuracy of positive signal  
 $= 1 - p(\text{false pos})$

Sufficient:  
low false pos  
high false neg

Optimal:  
low false pos  
low false neg

Inferior:  
high false pos  
high false neg

Necessary:  
high false pos  
low false neg

Accuracy of negative signal  $= 1 - p(\text{false neg})$

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- Attractiveness of alternate projects (base rate)

# Preliminary Findings

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- Relevance of waypoints to PM does not drive pursuit by PI
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- Usefulness of waypoints depends on context:
  - When alternative project is attractive, prefer sufficient waypoints
  - When alternative unattractive, prefer necessary waypoints

# Empirics: Commercialization of ISS Research

- Commercialization Endpoint: defined as entry into commerce of an ISS-related innovation for a non-space, non-NASA market (14 out of 318)
- Candidate waypoints: Patents, Citations, Publications in high-impact outlets
  - Conditioning Factor: Sector of PIs (corporate vs. academic)
- NASA-funded project must play a significant role in origin of the innovation (not mere testing of an off-the-shelf product)

# Fun With Data



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- Non-linear innovation pathways
  - KES Science’s AiroCide® ethylene-mold removal system
- Key contributions by small and medium enterprises (SMEs)
  - AMS enabled by small entities such as Space Cryomagnetics Ltd.

# Results from Multivariate Logistic Regression

		Corporate PI		No Corporate PI	
		Patent	No Patent	Patent	No Patent
>100 "Good" Cites	Yes	-	0.496	-	0.178
	No	0.253	0.003	0.07	0.001

# Next Steps

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  - Waypoints are not created equal
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  - Waypoints are not created equal
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  - Impact of second-order effects: availability of alternates
- Expand:
  - Additional waypoints: follow-on funding (SBIR, etc.)
  - Full accounting for game-ability of waypoints
  - Particularly for ISS program, PI incentives to reach endpoint
  - Add endpoints: scientific discovery, engineering research

# Policy Implications

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  - Vital role for peer review process

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- A new way to make the case for scientific research: beyond broader impact and waiting for moonshots
  - Contrast with NASA's attempts to justify ISS
- Accept that some programs cannot be protected from political influence without additional work
  - Vital role for peer review process
- Innovation as incremental process rather than one-and-done