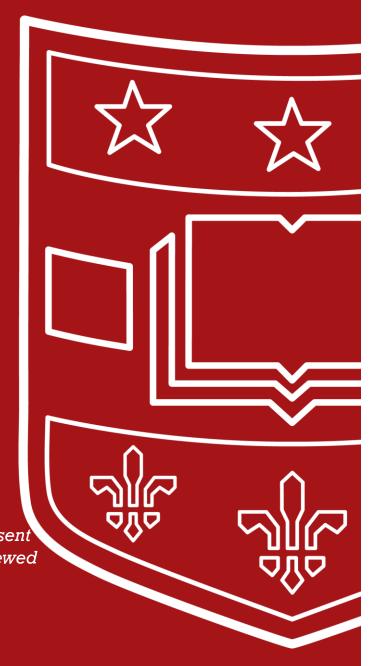
Measuring Value ...of R&D

2019 NSF ERC Planning Grant Workshop

Anne Marie Knott October 2, 2019

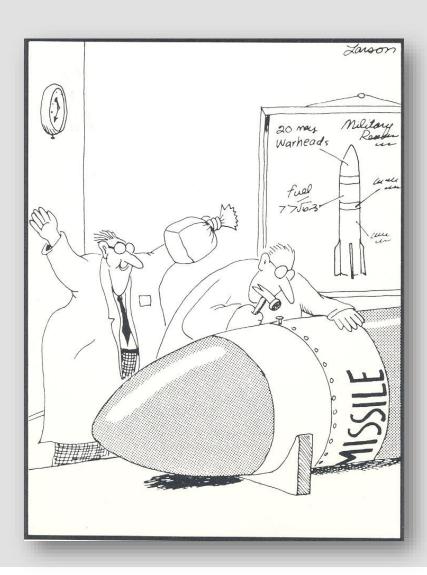
DISCLAIMERS: Any opinions and conclusions expressed herein are those of the author(s) and do not necessarily represent the views of the U.S. Census Bureau. All results have been reviewed to ensure that no confidential information is disclosed

Washington University in St. Louis



My life before academia





Hughes at the Knowledge Frontier



Raytheon

\$9.5B



\$3.75B

Missile Systems

Electro-Optical and Data Systems

Radar Systems



Hughes Research Lab

Space and Communications

Laser
Transistor
Synchronous-orbit Satellite

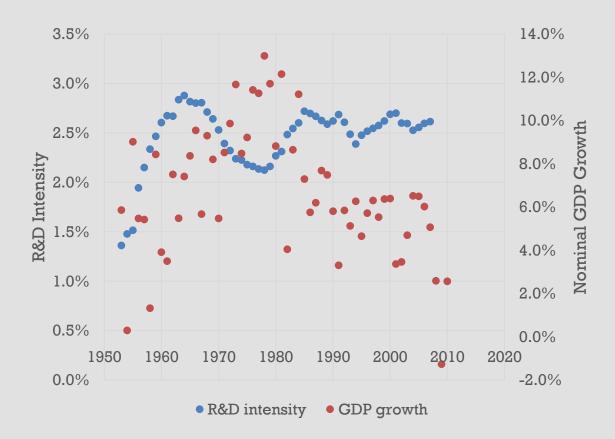
Ground Systems

\$26B



US Innovation Engine is Broken





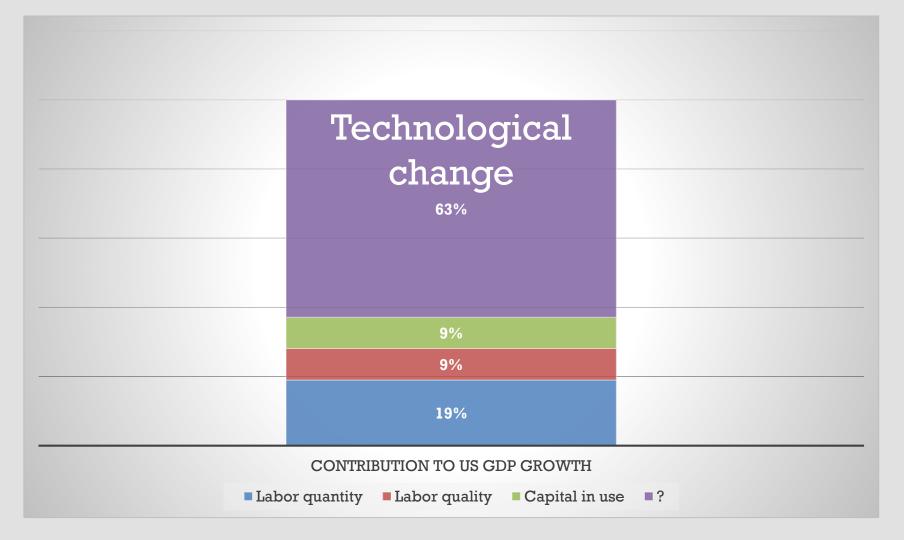
Why is Growth Important?



US 1900		US 2000
47.3 years	Life expectancy at birth	76.8 years
58 hours	Workweek	34.5 hours
\$490	Household Income	\$57,790
4.9 people	Household size	2.5 people
120%	Expenditures/income	79%
43%	Food share	13%*
19%	Home ownership	67%
1%	Indoor plumbing	100%
horse	Primary transport	car

Where does growth come from

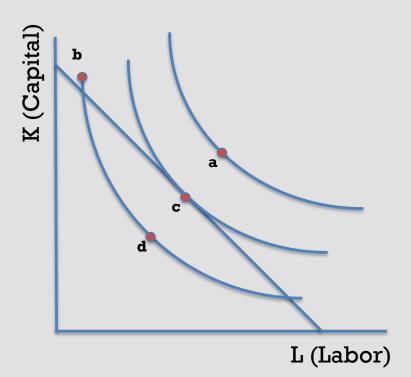




Romer's endogenous growth theory links R&D to growth

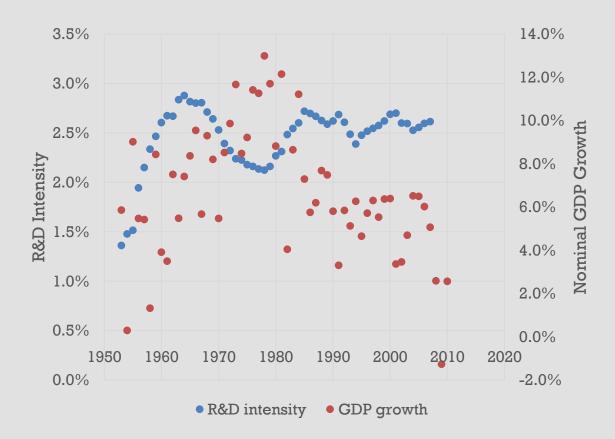


- Adds knowledge, A, to the production function:
 - $Y=K^{\alpha}L^{\beta}A$
- Which comes from R&D, R:
 - $-A'=\delta AR$
- Most important conclusions:
 - Economy grows in perpetuity
 - Scale effects: doubling R doubles g:
 - $g_Y = g_A = \delta R$



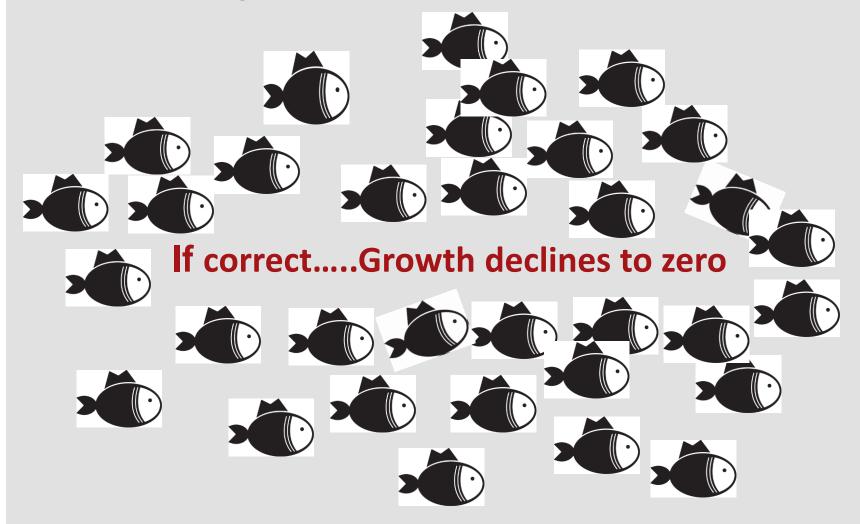
US Innovation Engine is Broken





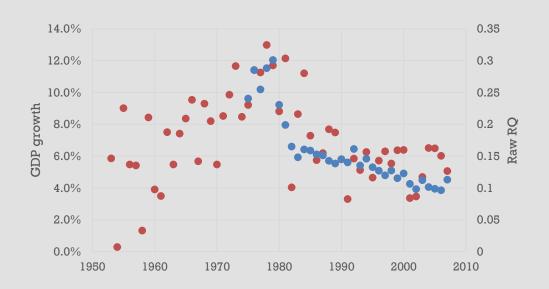
Leading explanation for broken link: R&D has gotten harder





My explanation: Companies have gotten worse at R&D





● GDP growth ● raw RQ

Hope: If we can restore RQTM, we can revive growth

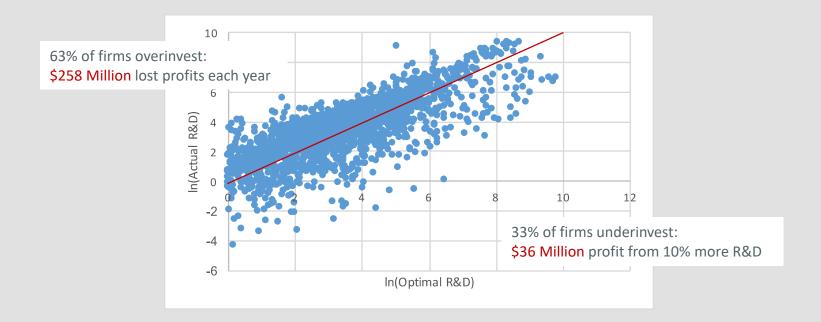
The Problem: Everyone flying blind with respect to managing R&D



- No good measures of R&D effectiveness
 - Sales/R&D is really an input measure
 - (51% of firms using)
 - Patents neither universal or uniform
 - Fewer than 50% of firms doing R&D patent; universality
 - 10% of patents comprise 85% of economic value; uniformity
 - Vitality Index only captures product innovation
- None of these measures is reliable
 - Anomaly in relationship to market value

Front-end implication: Firms unclear how much to spend



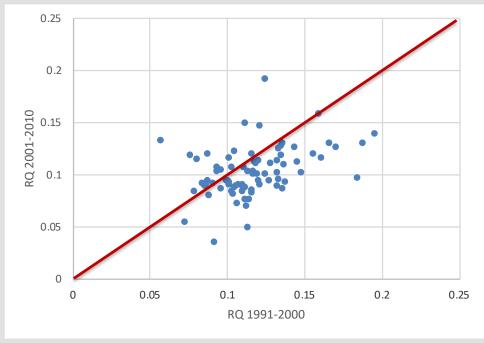


Less than 5% of firms' investment is within $\pm 10\%$ of optimum

Back end: Not sure what makes them (or prevents them from being) effective



Increasing RQ



Decreasing RQ

Flying Blind: A real world illustration



TALKING BUSINESS

Real Reason for Ousting H.P.'s Chief

By JOE NOCERA

Published: August 13, 2010

Charles House, a former longtime H.P. engineer ...now at Stanford University, openly rejoiced when he heard that Mr. Hurd was leaving. "I think the sexual harassment charge was a total red herring," Mr. Hurd was systematically destroying what had always made H.P. great. ... The research and development budget used to be 9 percent of revenue, ... now it was closer to 2 percent.

- Is Mr House right: Did Mark Hurd destroy what made HP great?
- With existing measures, we have no way of knowing!
 - Whether R&D capability has deteriorated, or by how much
 - Whether the correct investment is 9% or 2%

Not all companies fly blind

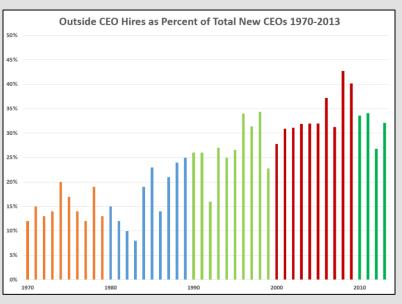


In the past, companies were run by CEOs with in-depth knowledge of industry/technology

"do the right things and profits will follow"

Pat Hyland, Hughes Aircraft Company VP 1954 to 1976, President 1976-1984

Now often run by outsiders, who must manage by numbers



Founder run companies typically have high RQ

RQTM offers flight instrument for R&D



- RQ captures Romer's R&D productivity, δ
- Measured as the exponent, γ, on R&D:
 - $Y = K^{\alpha}L^{\beta}A$
 - Original Romer equation with knowledge, A
 - $-Y=K^{\alpha}L^{\beta}R^{\gamma}$
 - Substituting A with the R&D that produces it
 - Technical definition:
 - "firm-specific output elasticity of R&D"
 - Practical translation:
 - percentage increase in output from 1% R&D increase

The theory underlying RQTM allows you to derive outcomes



$$Y = K_{i,t}^{\alpha} L_{i,t}^{\beta} R_{i,t-1}^{\gamma}$$

$$\Pi = gross \ margin * \left[K_{i,t}^{\alpha} L_{i,t}^{\beta} R_{i,t-1}^{\gamma} \right] - R$$

• Optimal R&D
$$R_i^* = (a\gamma_i/(1-\delta))^{\frac{1}{1-\gamma_i}}$$

$$V = \Pi / (r-g)$$

$$R_i^{\gamma}$$

Important properties of RQTM



- Universal: Can estimate for any company doing R&D
- Uniform: Can compare companies, industries, countries
- Reliable: Matches theoretical expectations (over 47 years data for all US traded firms):
 - Increasing RQ increases optimal R&D investment
 - Increasing RQ increases market value
 - Increasing RQ increases firm growth
 - NO OTHER MEASURE FOR WHICH ALL 3 HOLD
 - Patent intensity, Total Factor Productivity, Idea TFP
 Market response to patent approval

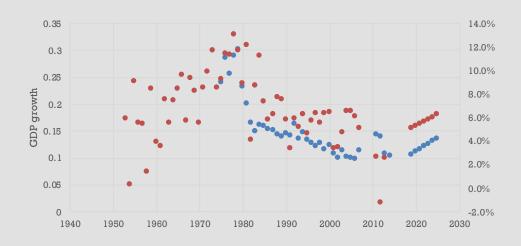
What RQ can't do



- Can't measure the value of innovation in companies that don't do R&D
 - 7% of firms in BRDIS without R&D report new or significantly improved product in prior 3 years
- Can't measure the value of R&D in organizations where R&D doesn't drive revenues (universities, government labs)
 - But 71% of R&D is done in companies

So how do we reverse the RQ and GDP trends?





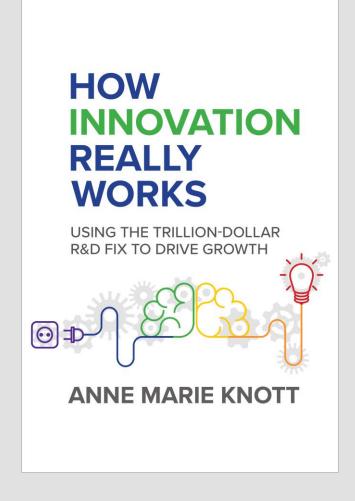
• raw RQ • GDP growth

Use measurement!
...to identify and implement high RQ practices

Evidence-based prescription



- NSF grants linking companies' R&D practices to their RQs
 - NSF Award 0965147:
 Firm IQ: A Universal,
 Uniform and Reliable
 Measure of R&D
 Effectiveness
 - NSF Award 1246893:
 The Impact of R&D
 Practices on R&D
 Effectiveness



Test your intuition Let's play "R&D Idol"!



Please text:

AnneMarieKno511 to 37607

to share them

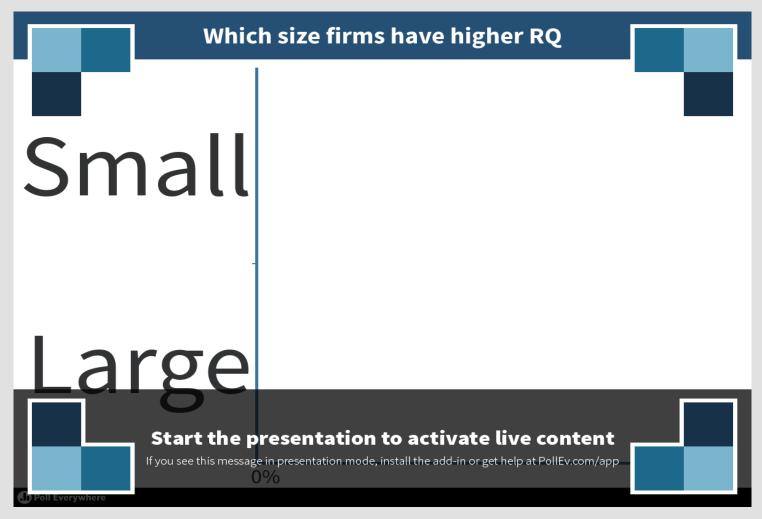
Seven Innovation Prescriptions



- Small Companies are More Innovative
- 2 Uncontested Markets are Good for Innovation
- 3 Spending More on R&D Increases Innovation
- 4 Companies Need More Radical Innovation
- Open Innovation Turbocharges R&D
- 6 R&D Needs to be More Relevant
- 7 Wall Street Values Innovation

Your Perceptions of Firm Size





The Evidence on Company Size



- Large firms have 13.5% higher RQ than small firm
- 2 Uncontested Markets are Good for Innovation
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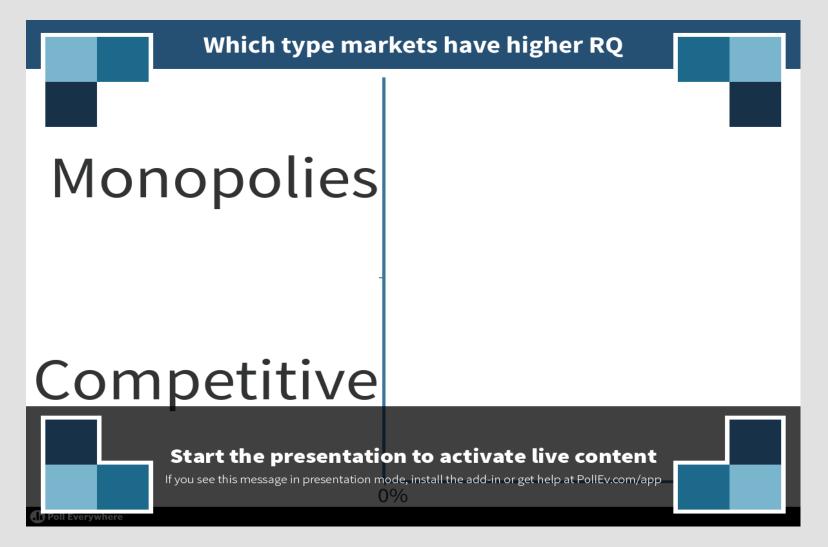
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Your Perceptions of Market Type





The Evidence on Market Structure



- Small Companies are More Innovative
- Monopolies lead to high profits, but low innovation
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The Evidence on Spending



- Small Companies are More Innovative
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- 3 63% of companies overinvest in R&D
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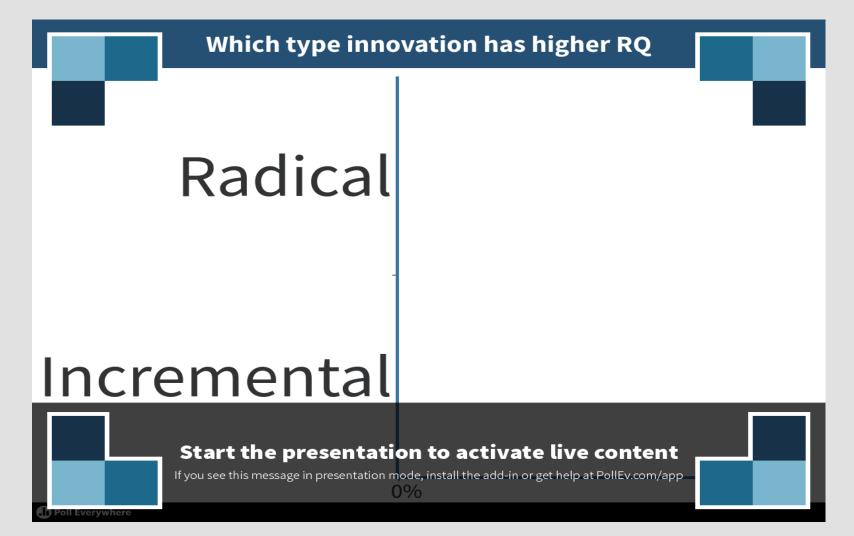
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Your Perceptions of Radical Innovation





The Evidence on Radical Innovation



- Small Companies are More Innovative
- 2 Uncontested Markets are Good for Innovation
- 3 Spending More on R&D Increases Innovation
- Radical innovation decreases RQ
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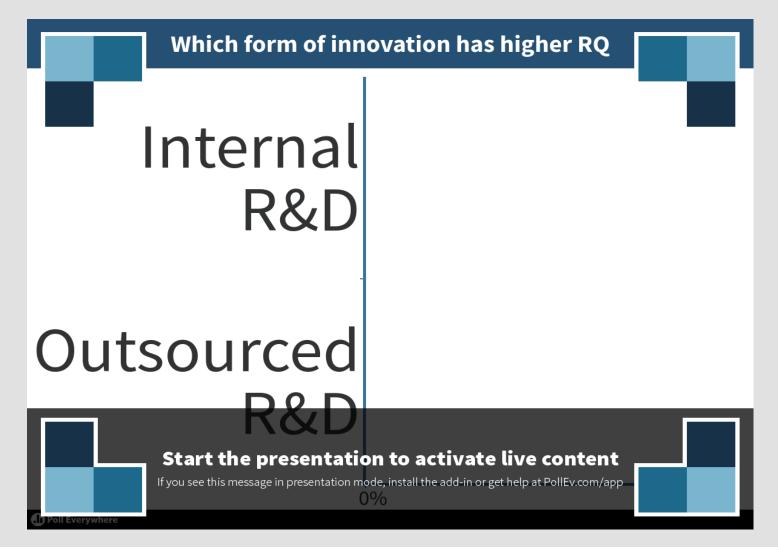
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Your Perceptions of Open Innovation





The Evidence on Open Innovation



- Small Companies are More Innovative
- 2 Uncontested Markets are Good for Innovation
- 3 Spending More on R&D Increases Innovation
- 4 Companies Need More Radical Innovation
- The RQ for outsourced R&D is **ZERO**
- 6 R&D Needs to be More Relevant
- 7 Wall Street Values Innovation

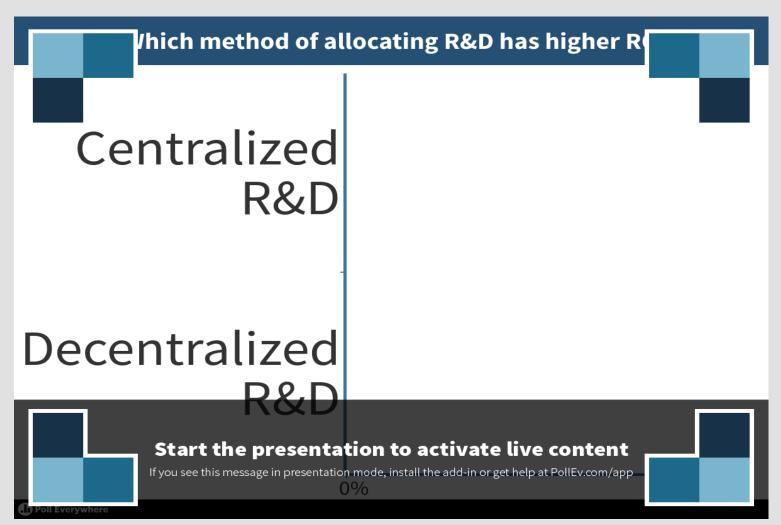
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Your Perceptions of Relevance





The Evidence on Relevancy



- Small Companies are More Innovative
- 2 Uncontested Markets are Good for Innovation
- 3 Spending More on R&D Increases Innovation
- 4 Companies Need More Radical Innovation
- Open Innovation Turbocharges R&D
- 6 Companies with centralized R&D have 40-64% higher RQ
- 7 Wall Street Values Innovation

Seven Innovation Prescriptions



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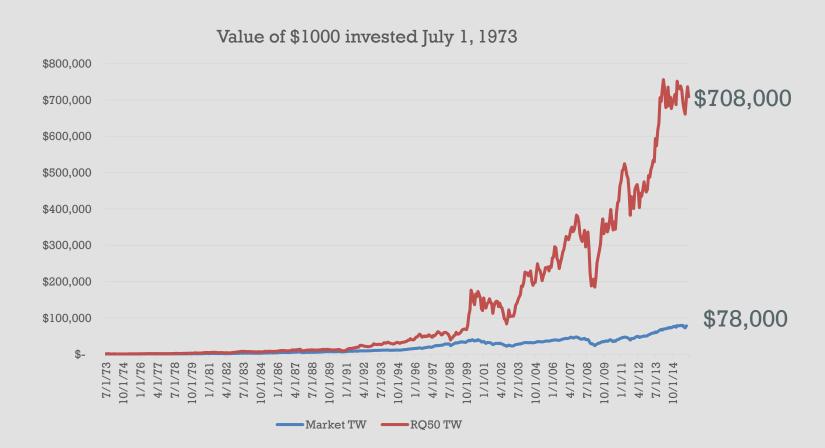
The Evidence on Wall Street



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- 6 R&D Needs to be More Relevant
- 7 Wall Street doesn't know how to value innovation

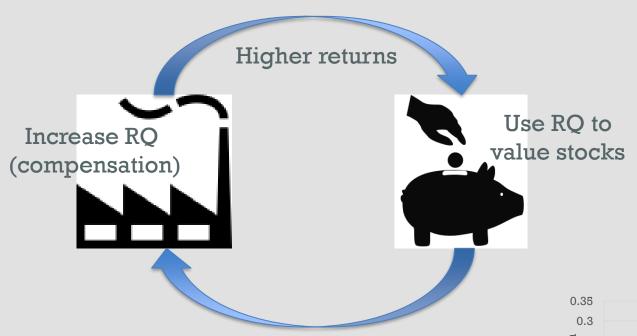
The Most Powerful Evidence for RQTM





The more selfish firms and investors are, the closer I get to my goal





Shift investment toward high RQ companies

