

*Stanford CS-HCI: October 30, 2019*

# **Human-Centered Artificial Intelligence: Designing Next Generation User Experiences**

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Founding Director (1983-2000), Human-Computer Interaction Lab  
Professor, Department of Computer Science

Member, National Academy of Engineering



Photo: BK Adams





Interdisciplinary research community

- Computer Science & Info Studies
- Psych, Socio, Educ, Jour & MITH

[hcil.umd.edu](http://hcil.umd.edu)  
[vimeo.com/72440805](https://vimeo.com/72440805)

# *Designing the User Interface*

## Design Theories

Direct manipulation

Menus, speech, search

Social Media

Information Visualization

[www.cs.umd.edu/hcil/DTUI6](http://www.cs.umd.edu/hcil/DTUI6)

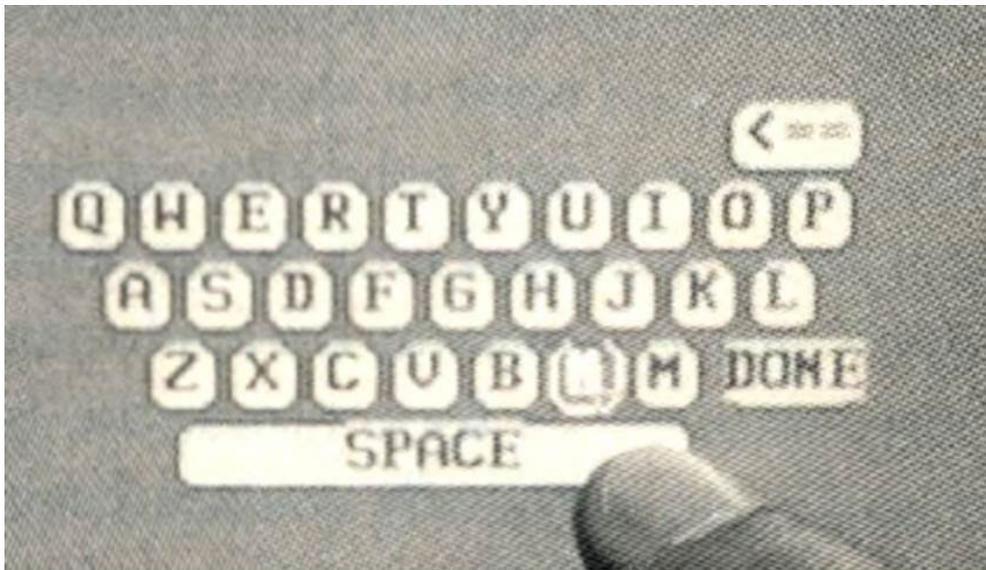


**Sixth Edition: 2016**

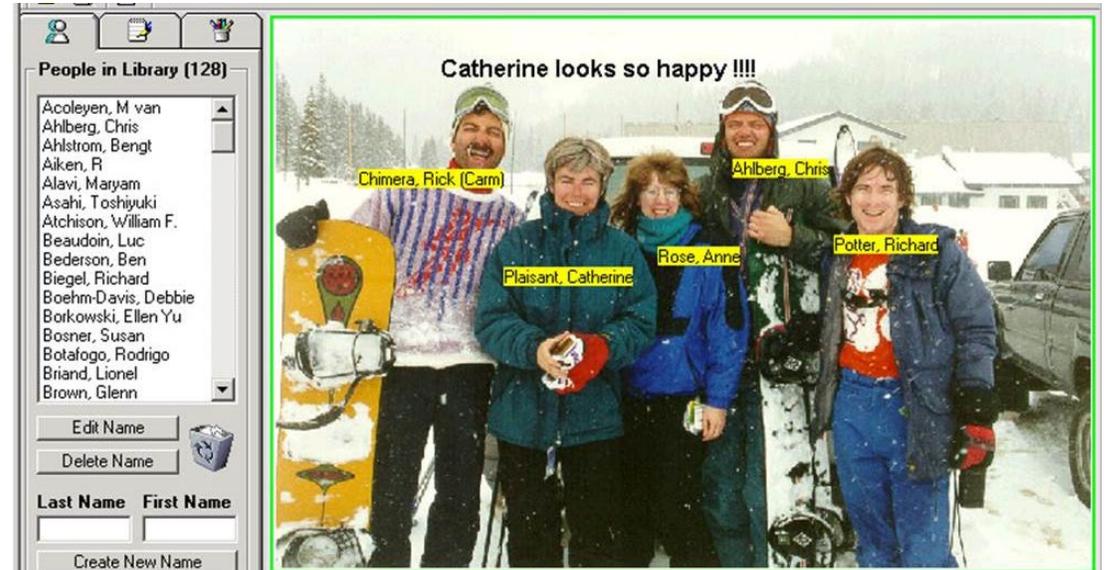
# Web links

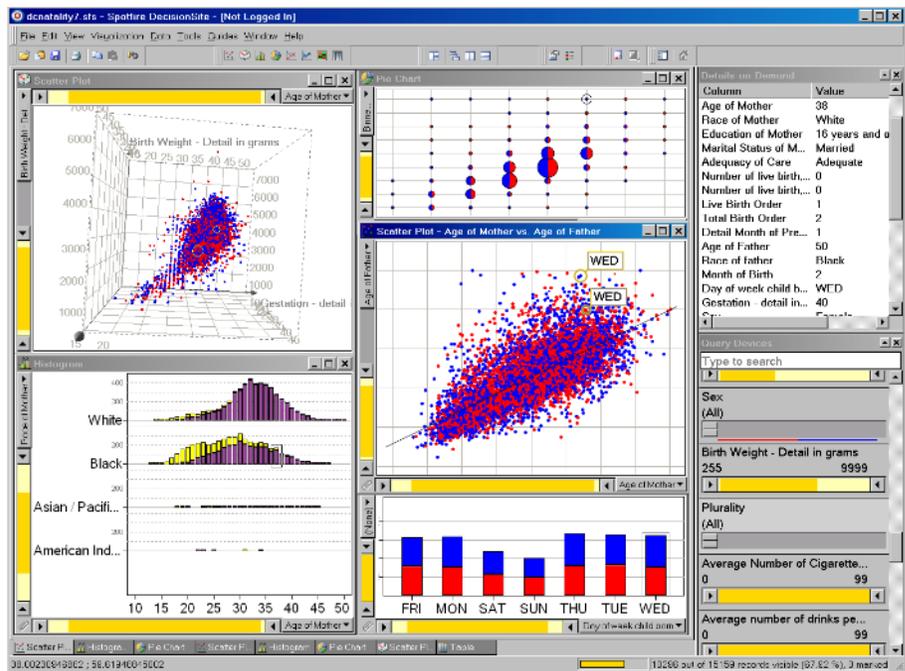
The **University of Maryland, College Park** (often referred to as the **University of Maryland, Maryland, UM, UMD, UMCP**, or **College Park**) is a public research university<sup>[10]</sup> located in the city of **College Park** in **Prince George's County, Maryland**, approximately 4 miles (6.4 km) from the northeast border of Washington, D.C. Founded in 1856, the university is the **flagship** institution of the **University System of Maryland**. With a fall 2010 enrollment of more than 37,000 students, over 100 undergraduate majors, and 120 graduate programs,

# Tiny touchscreen keyboards



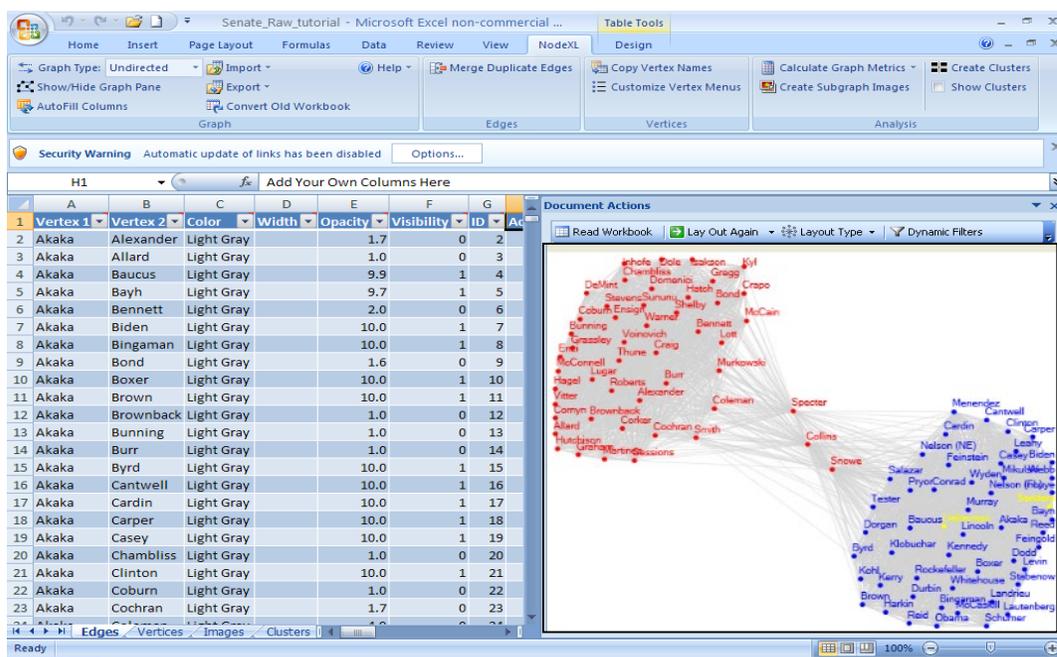
# Photo tagging



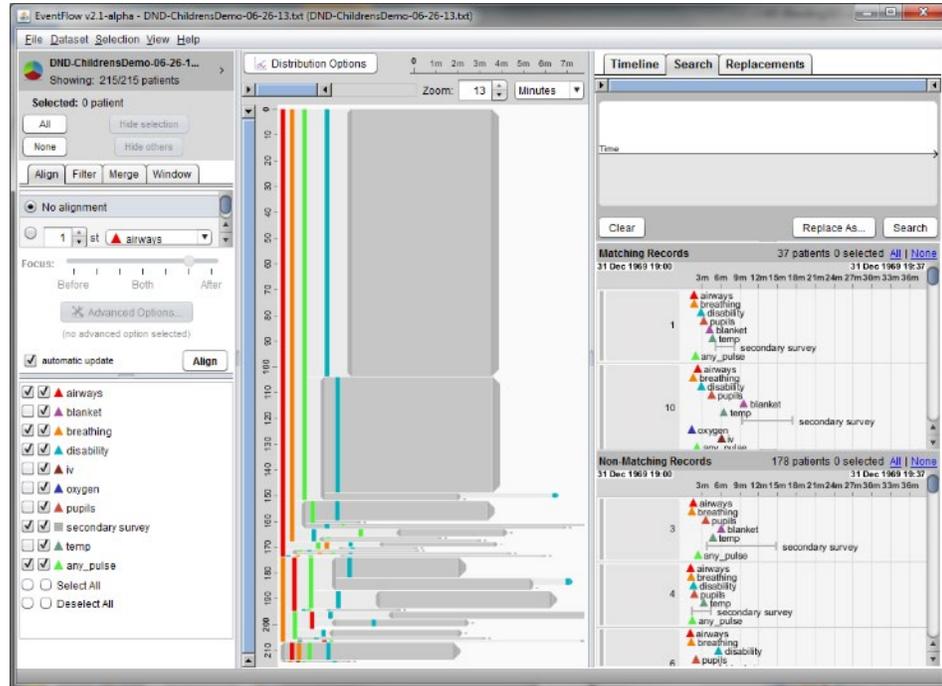


Spotfire

Treemaps  
FinViz



NodeXL



EventFlow



# Rationalism vs Empiricism

**Rationalism:** logical perfectability of human endeavors

*Aristotle, Descartes, Spinoza & Kant*

**Empiricism:** need to continuously refine our beliefs  
based on our experiences

*Leonardo, Galileo, Locke & Hume*

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*Leonardo, Galileo, Locke & Hume ... John Tukey*

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*Leonardo, Galileo, Locke & Hume ... HCI*

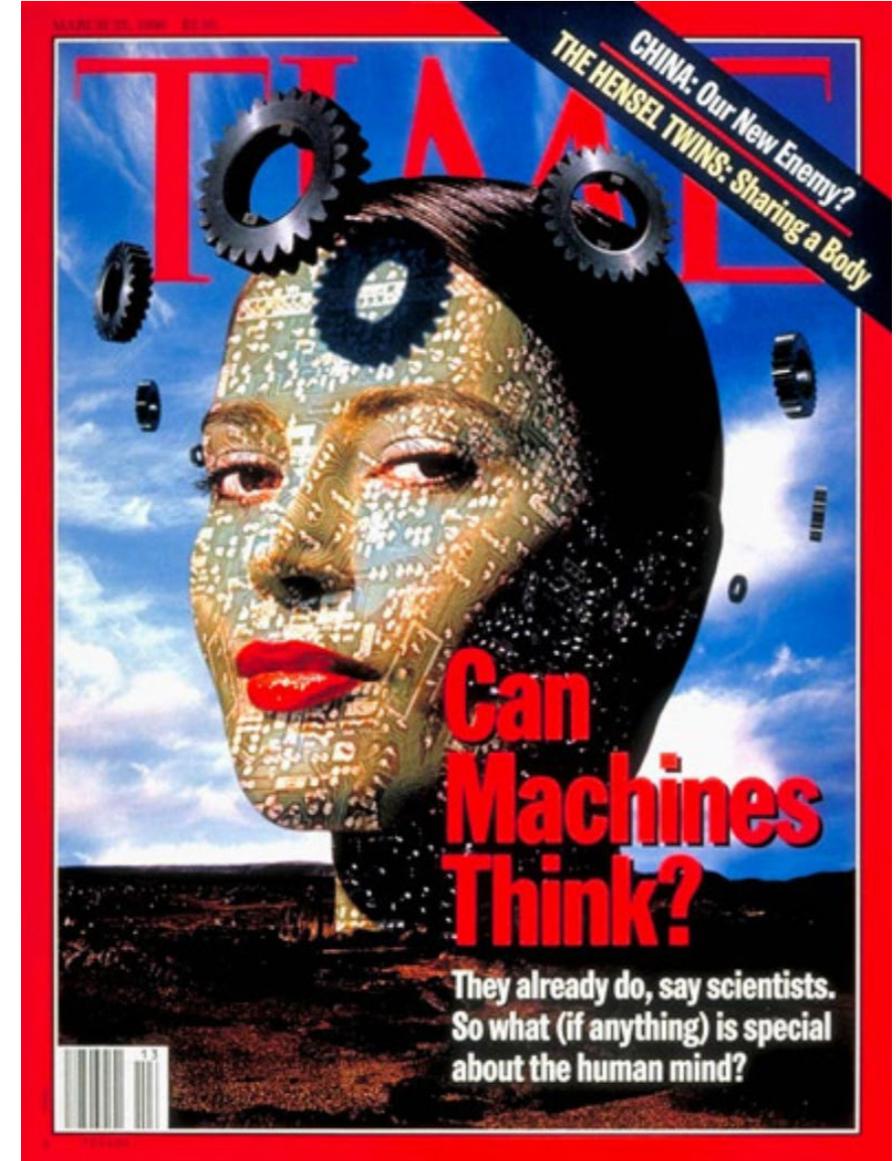
# Machines That Think

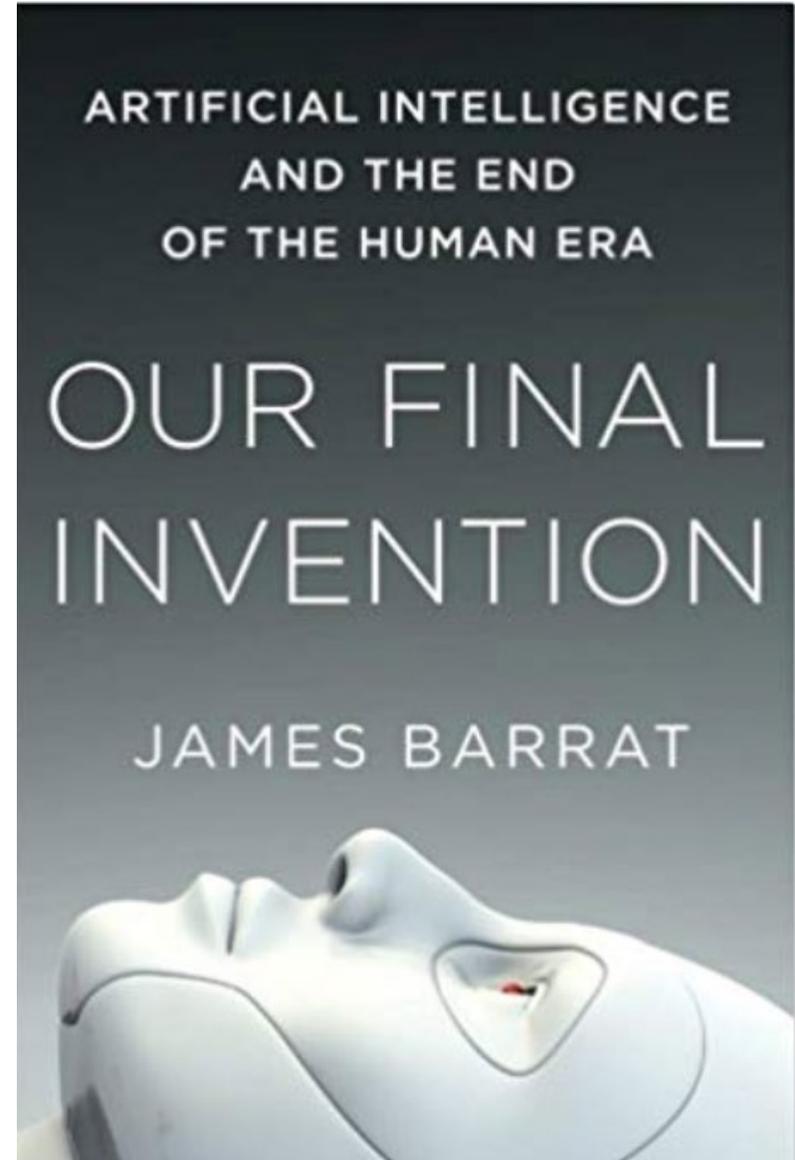
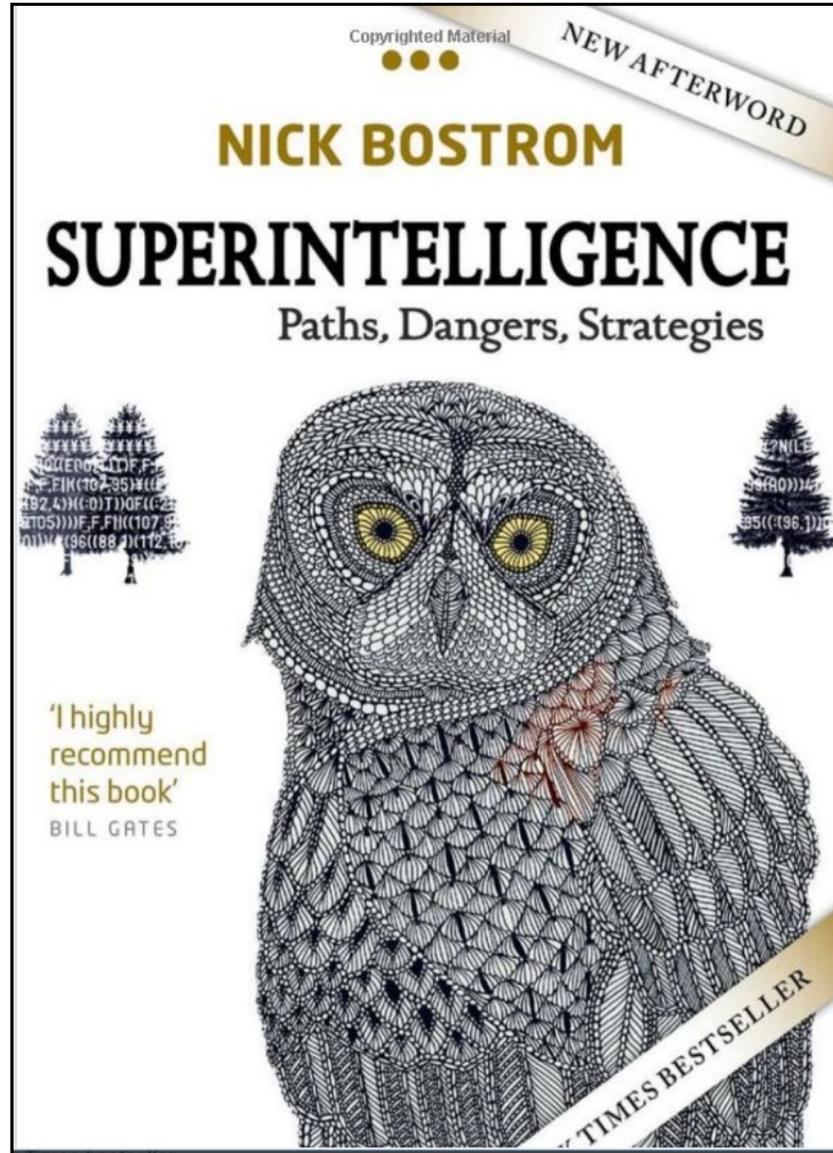
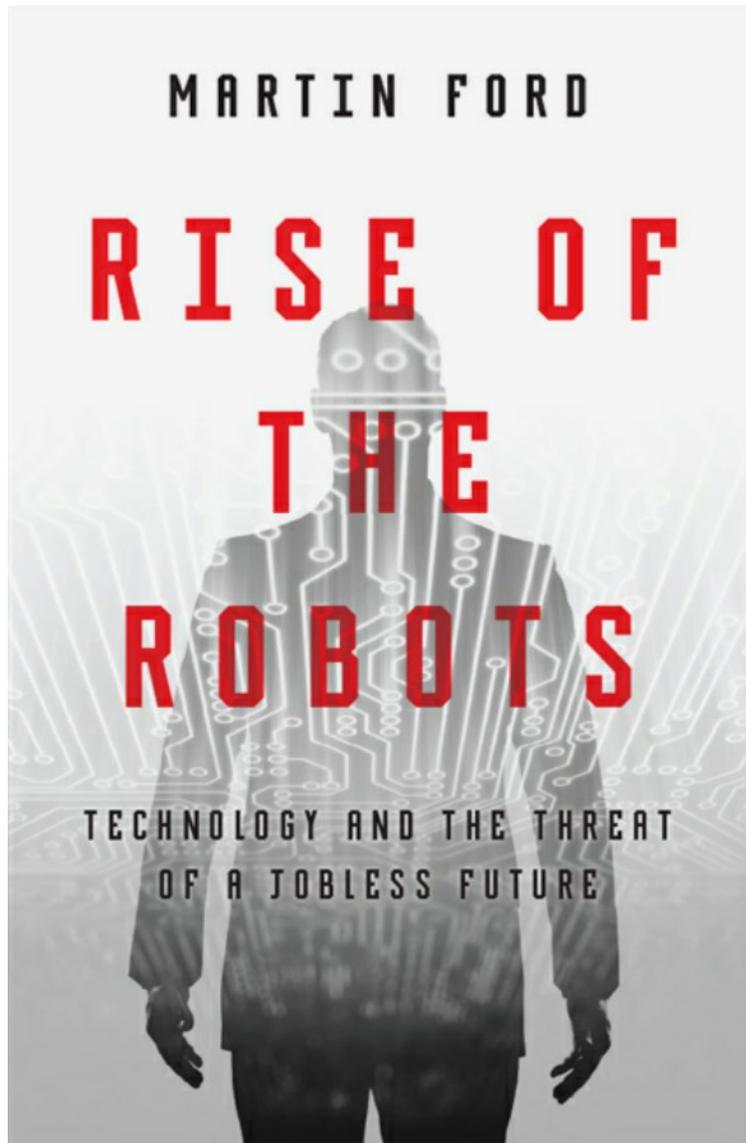
June 30, 1980



# Can Machines Think?

March 25, 1996





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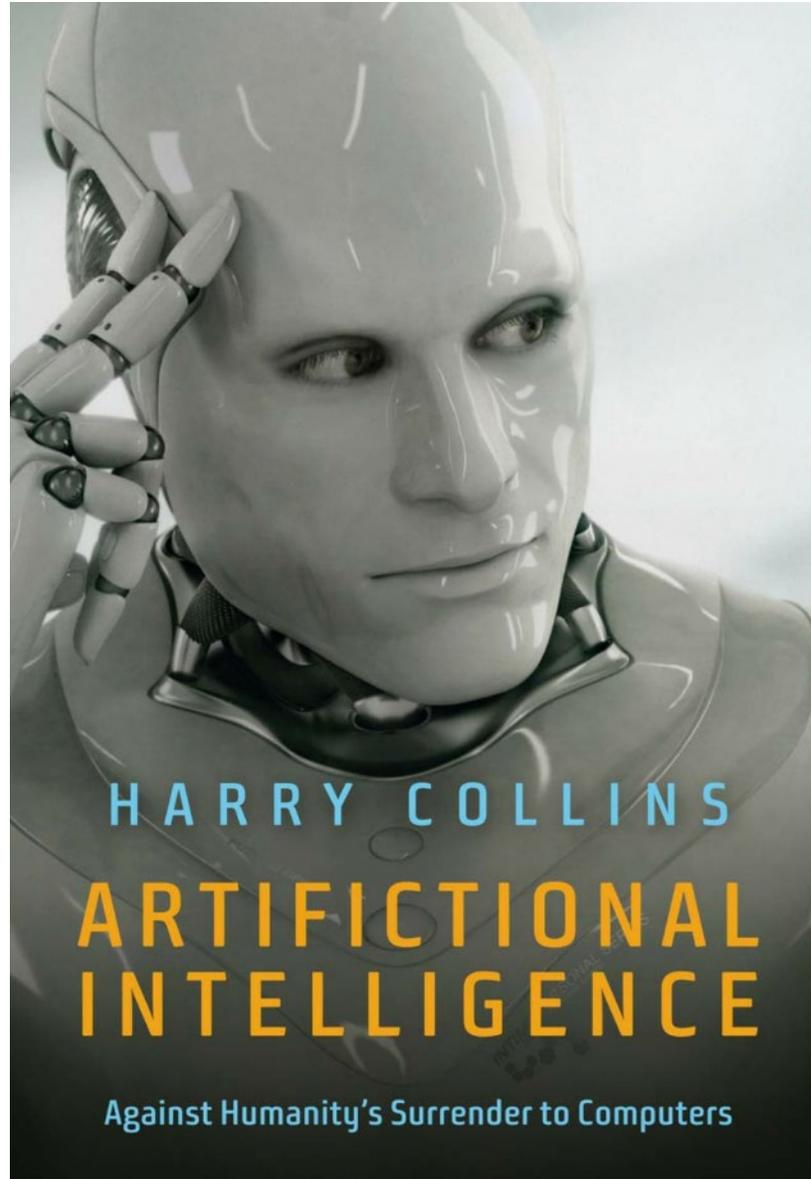
# WEAPONS OF MATH DESTRUCTION



HOW BIG DATA INCREASES INEQUALITY  
AND THREATENS DEMOCRACY

## CATHY O'NEIL

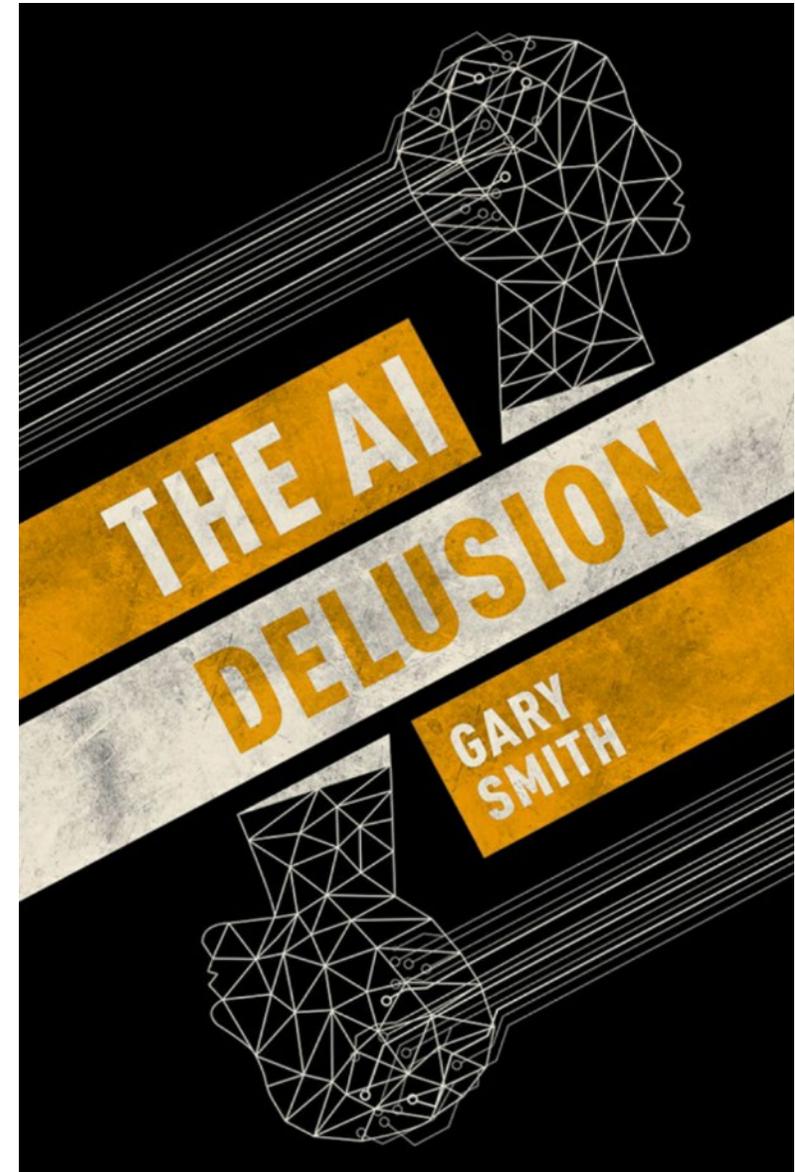
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HARRY COLLINS

# ARTIFICIAL INTELLIGENCE

Against Humanity's Surrender to Computers





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# REBOOTING

**AI** Building Artificial  
Intelligence We Can Trust

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**GARY MARCUS**  
and **ERNEST DAVIS**

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“so much of what we read about AI strikes us as pure fantasy, predicated on a confidence in AI’s imagined strengths that bears no relation to current technological capabilities”

# HCI Pride: Serving 6 Billion Users

**Mobile, desktop, web, cloud**

**Diverse users:**

**include everyone**

**Diverse applications:**

**real problems, users, data**

**Diverse interfaces:**

**theories, principles, guidelines**

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<b>Diverse applications:</b>	<b>real problems, users, data</b>
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## **Apple Design Guidelines**

### **User Control**

... people - not apps - are in control

### **Flexibility**

... (give) users complete, fine-grained control over their work

# AI design principles, which I want to change

- **Humanoid robots**
- **Excessive automation**
- Insufficient feedback
- Hidden features
- Restrictions on creativity
- Limits on collaboration
- Missing audit trails

# **What I want to achieve**

**Amplify, Augment, Enhance & Empower People**

# What I want to achieve

## Amplify, Augment, Enhance & Empower People

→ 1000-fold improvements in capabilities

Information

Search

Email & Text

Photography

Navigation

Business Formation

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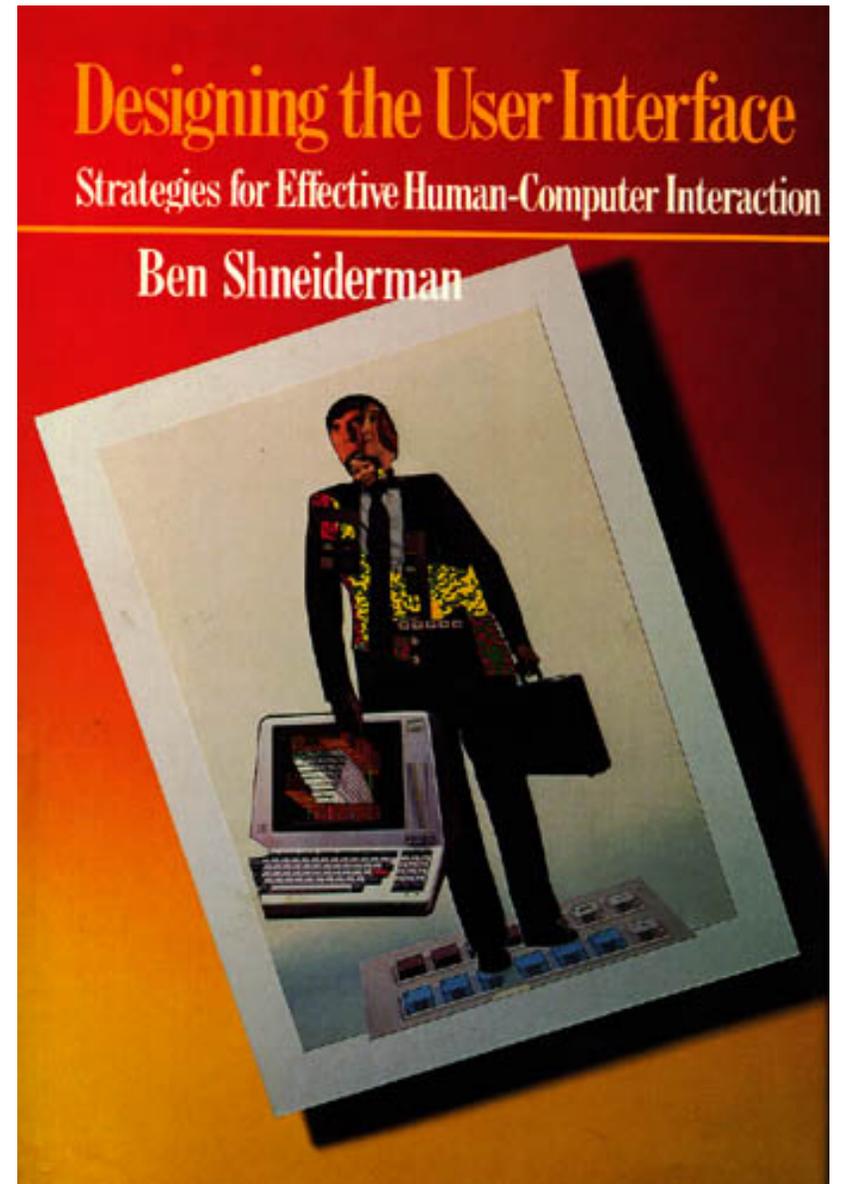
→ TRS: Trusted, Reliable & Safe

→ More people, more creative, more often

→ Self-efficacy & societal benefits

# *Designing the User Interface*

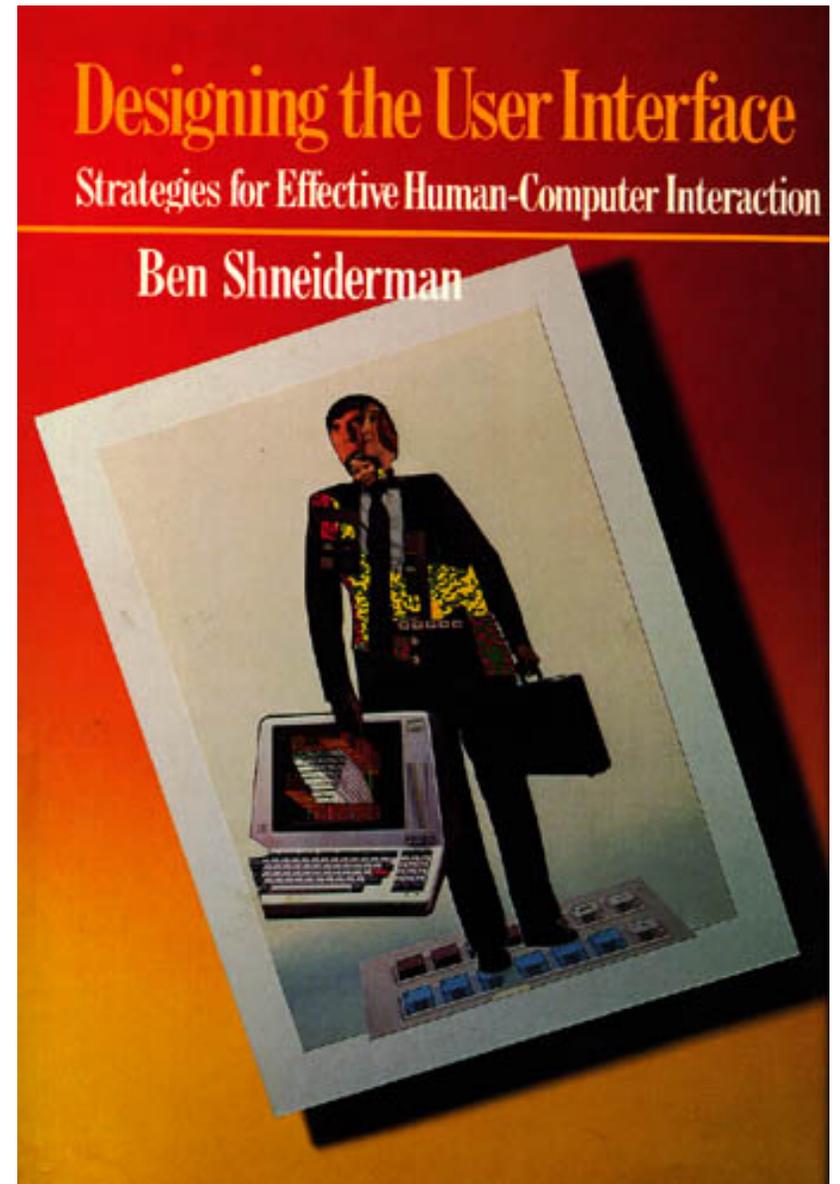
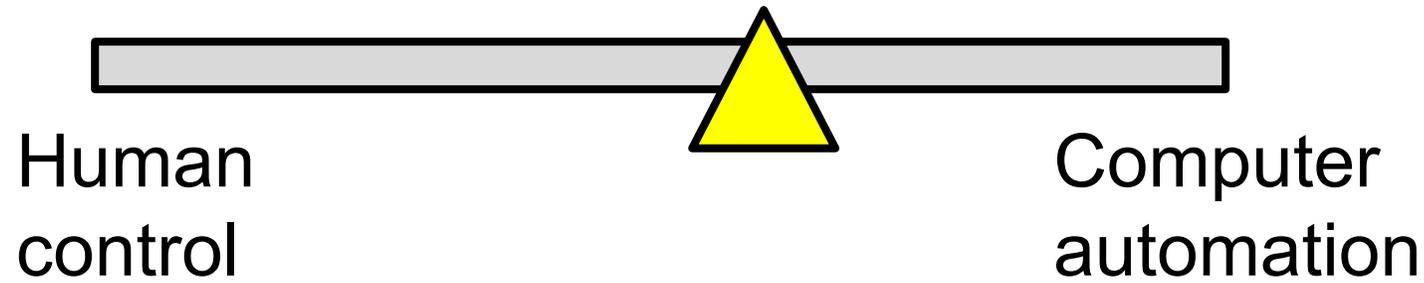
Balancing automation & human control



**First Edition: 1986**

# *Designing the User Interface*

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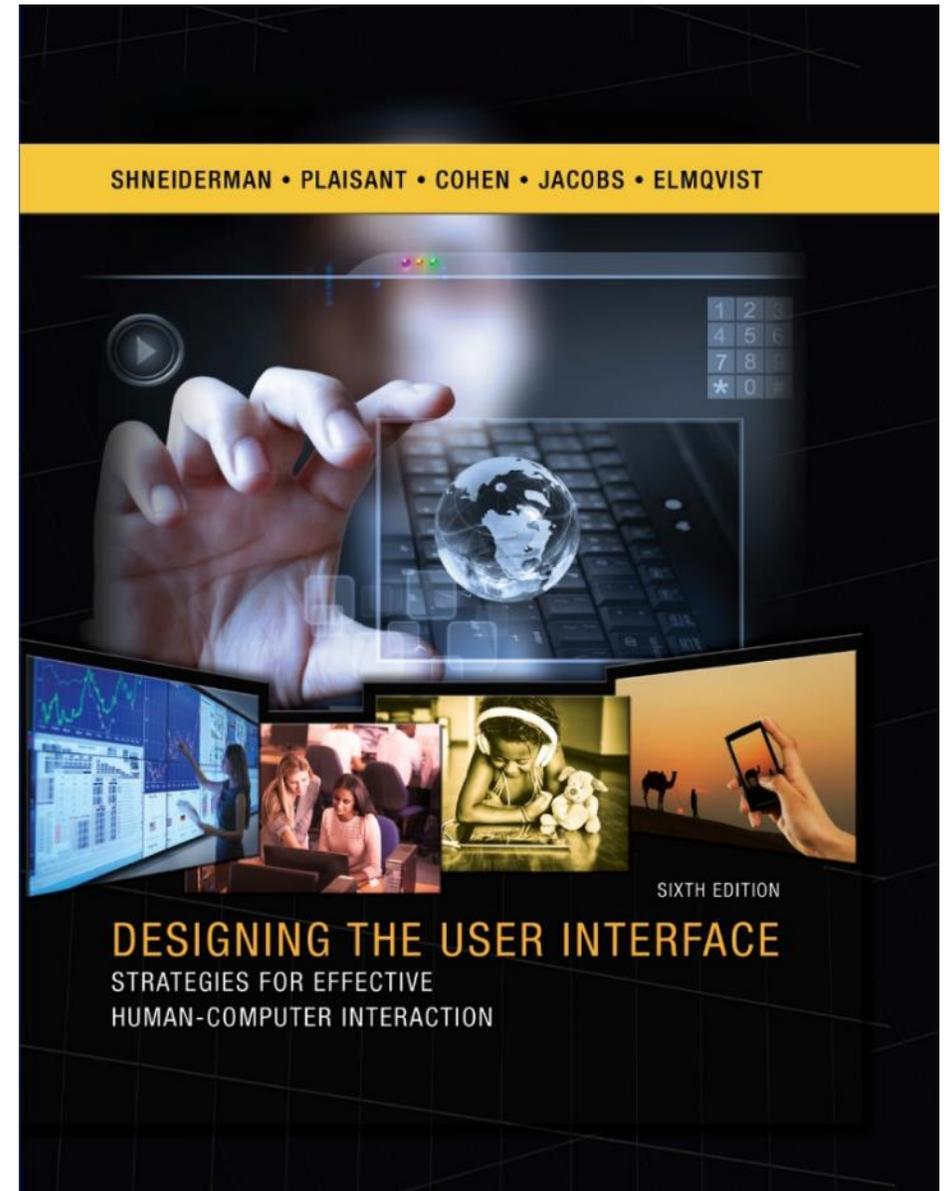
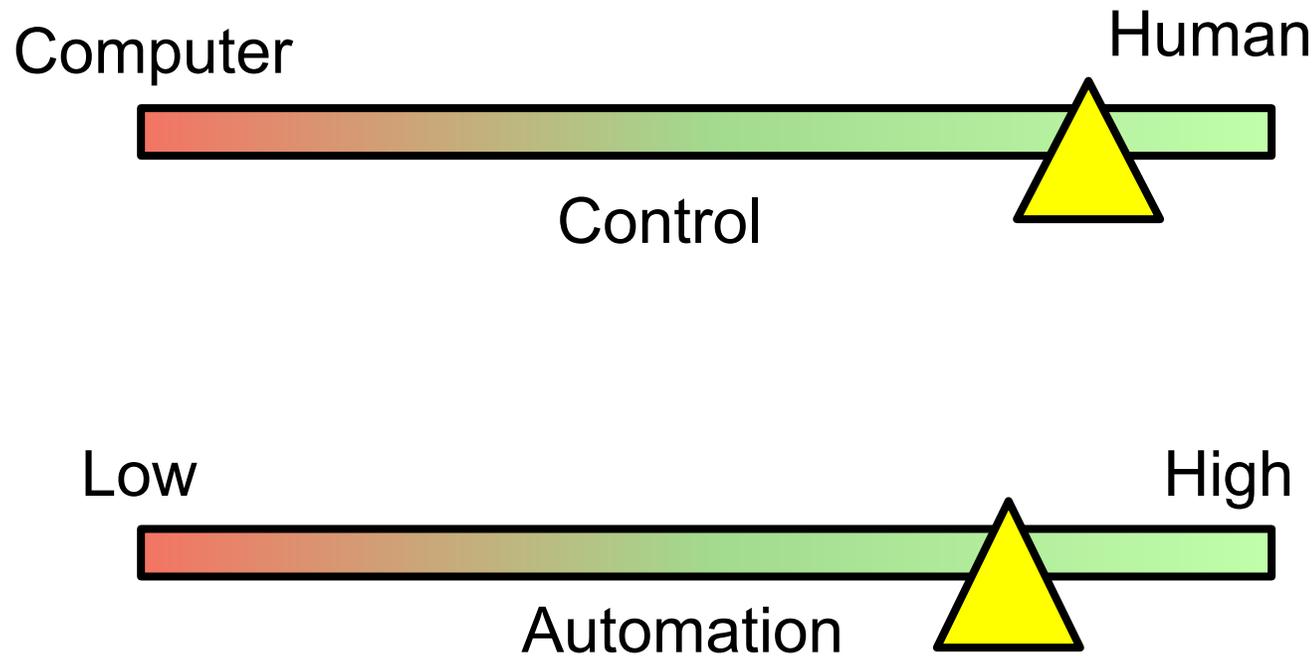
Ensuring human control  
while increasing automation



**Sixth Edition: 2016**

# Designing the User Interface

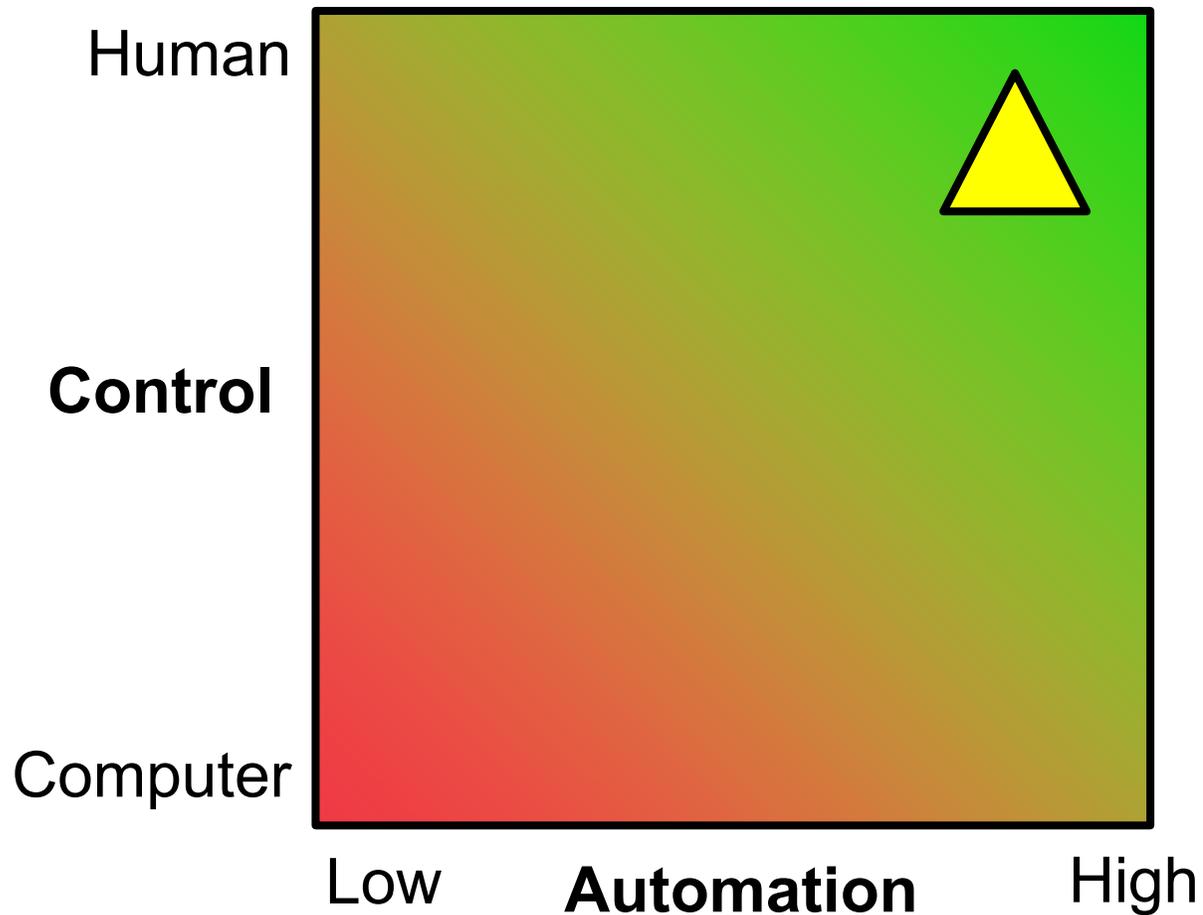
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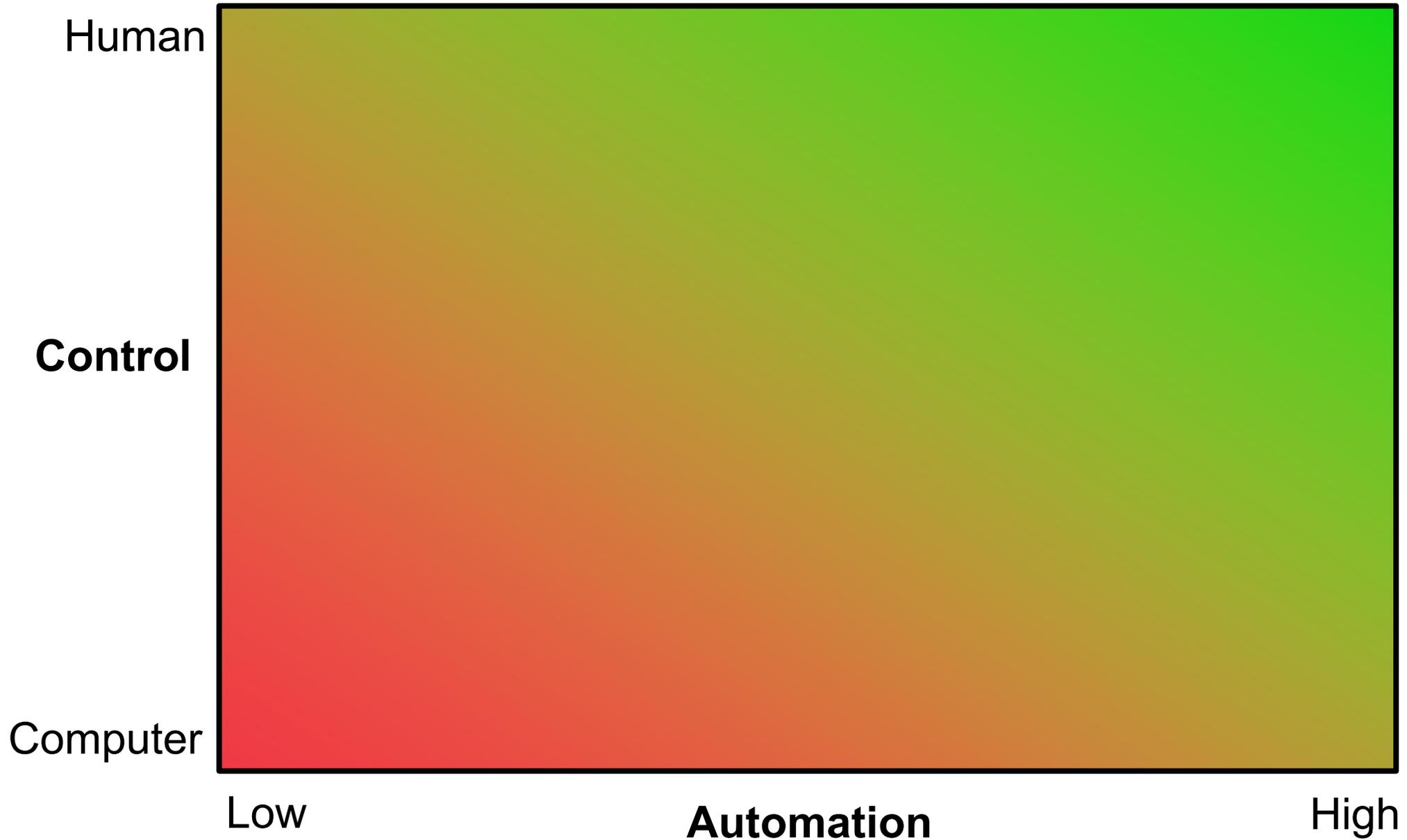
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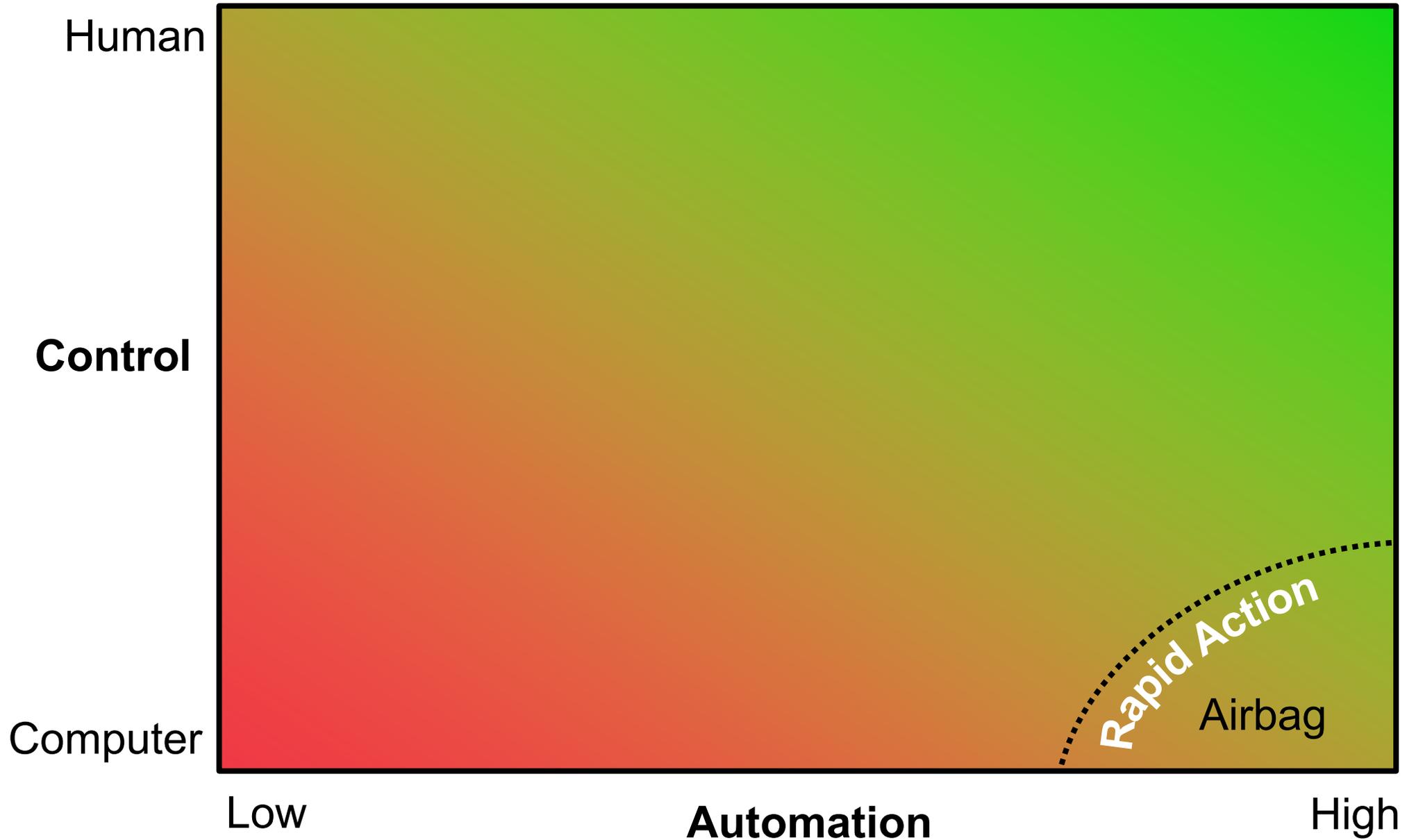


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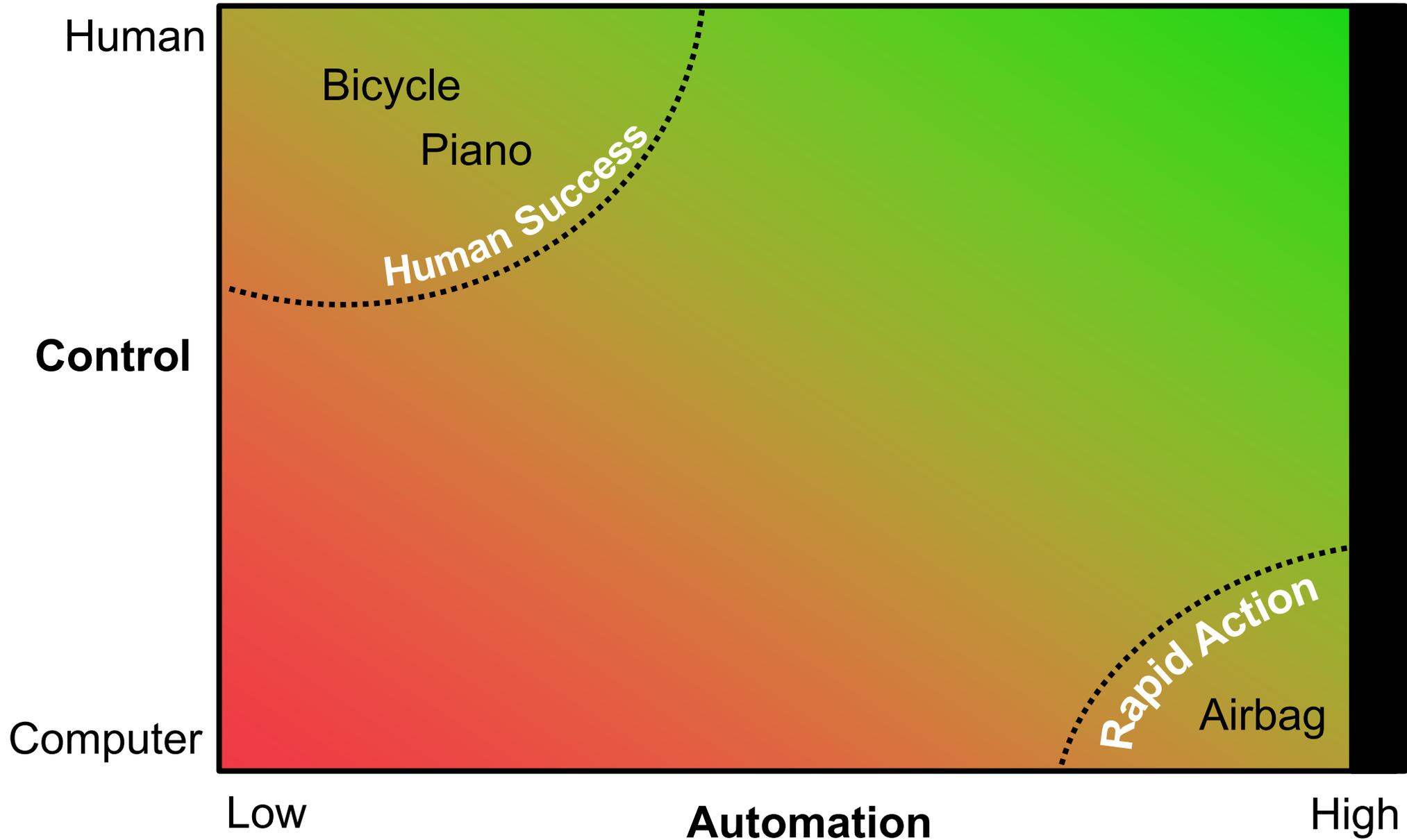
# Landscape of Automation



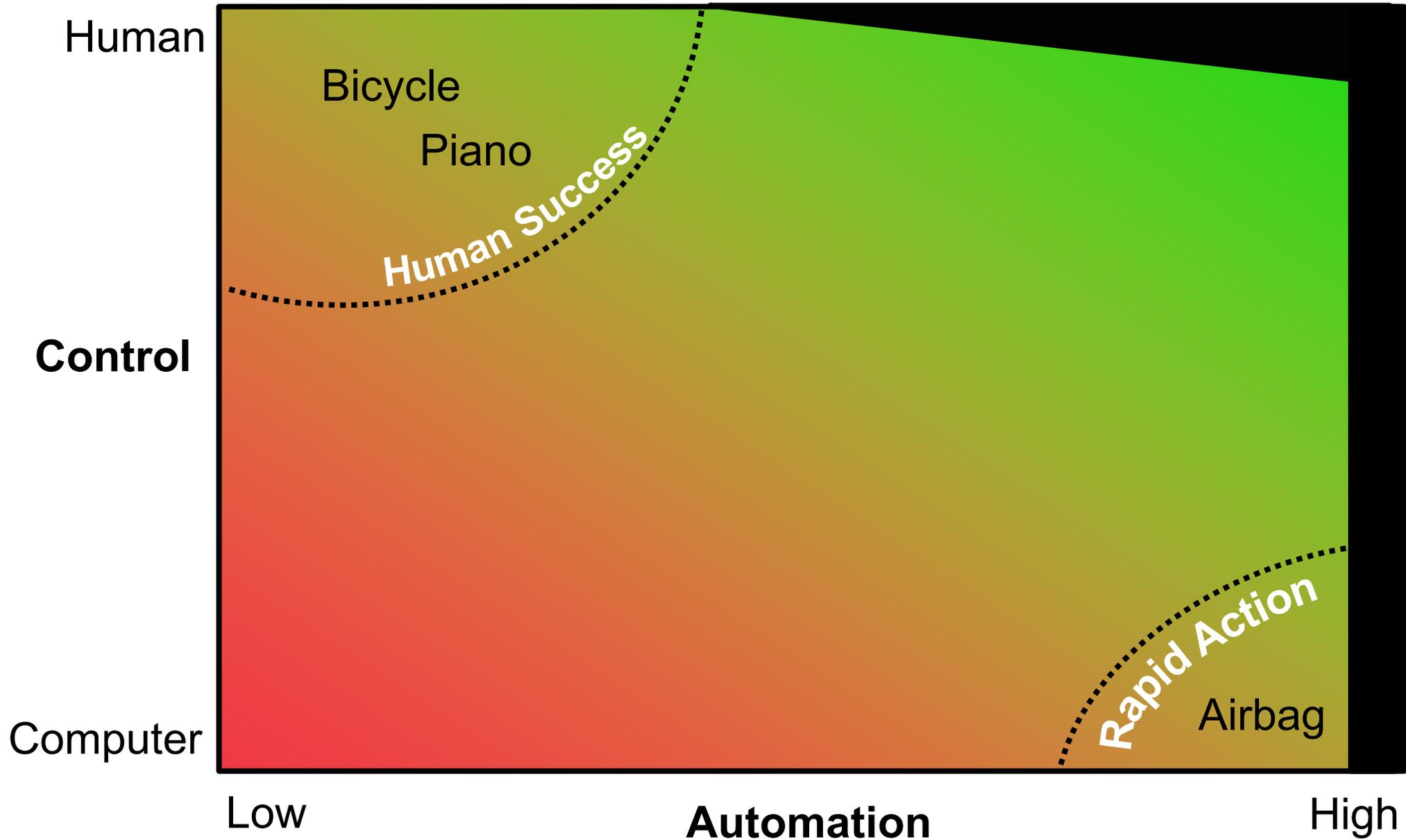
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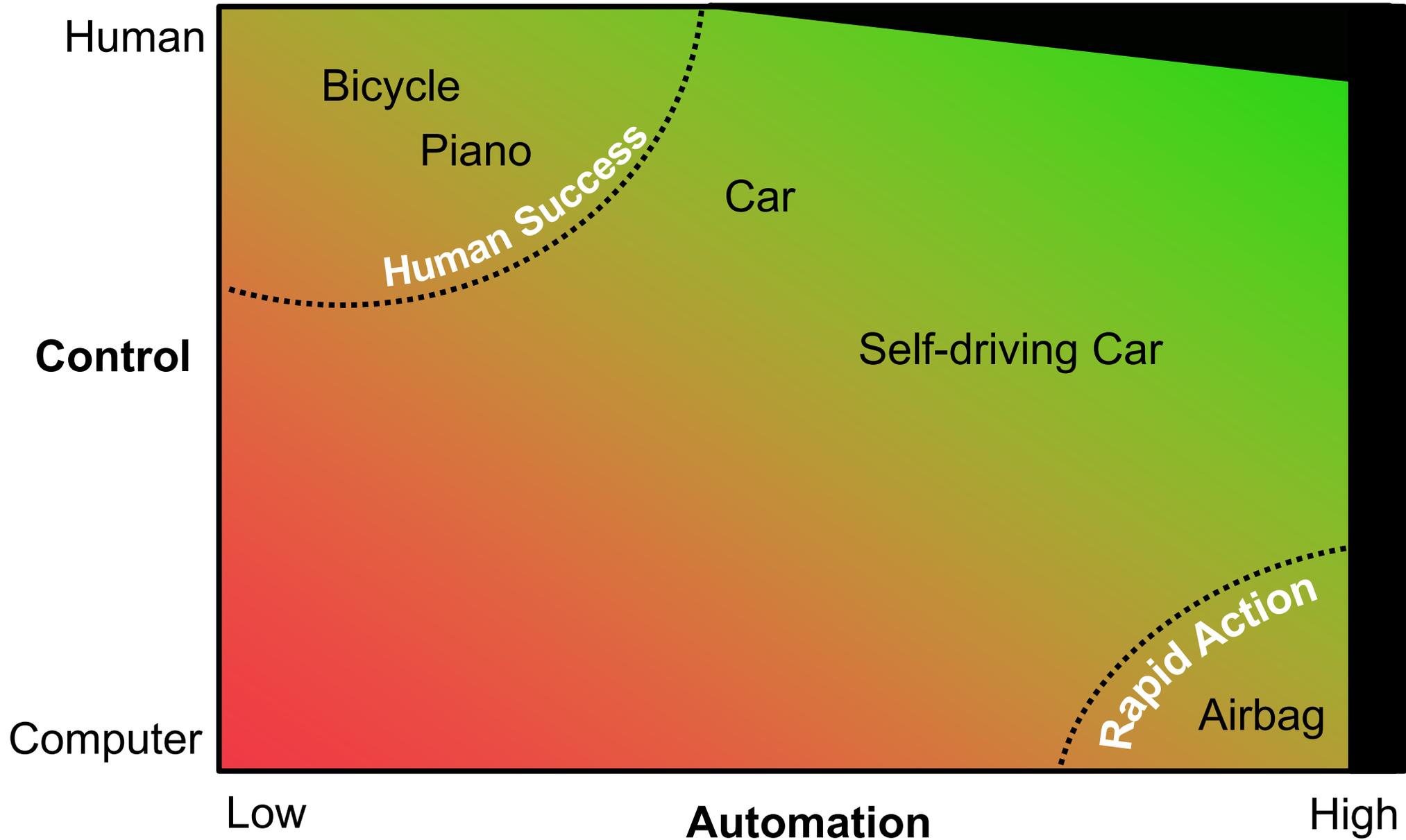
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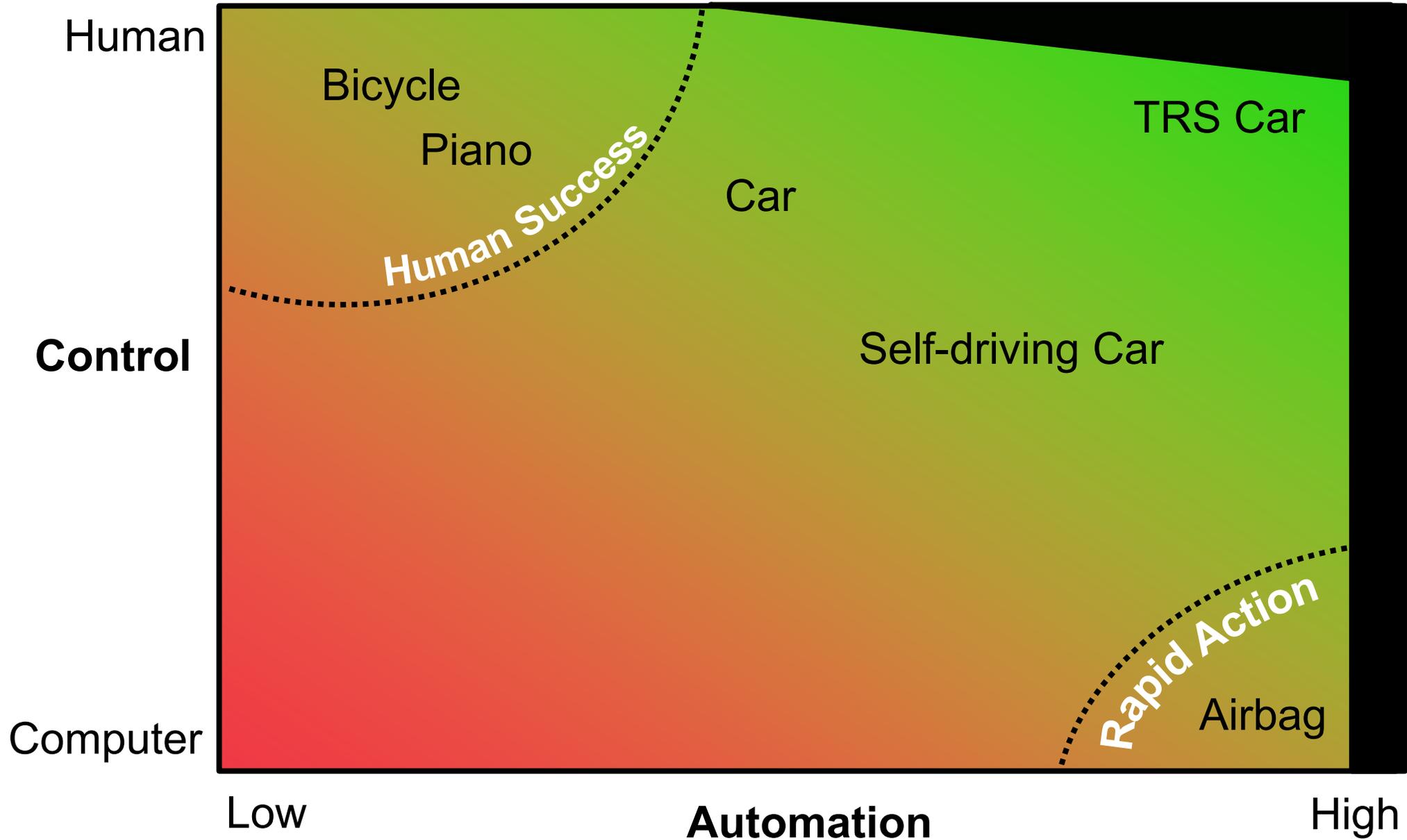
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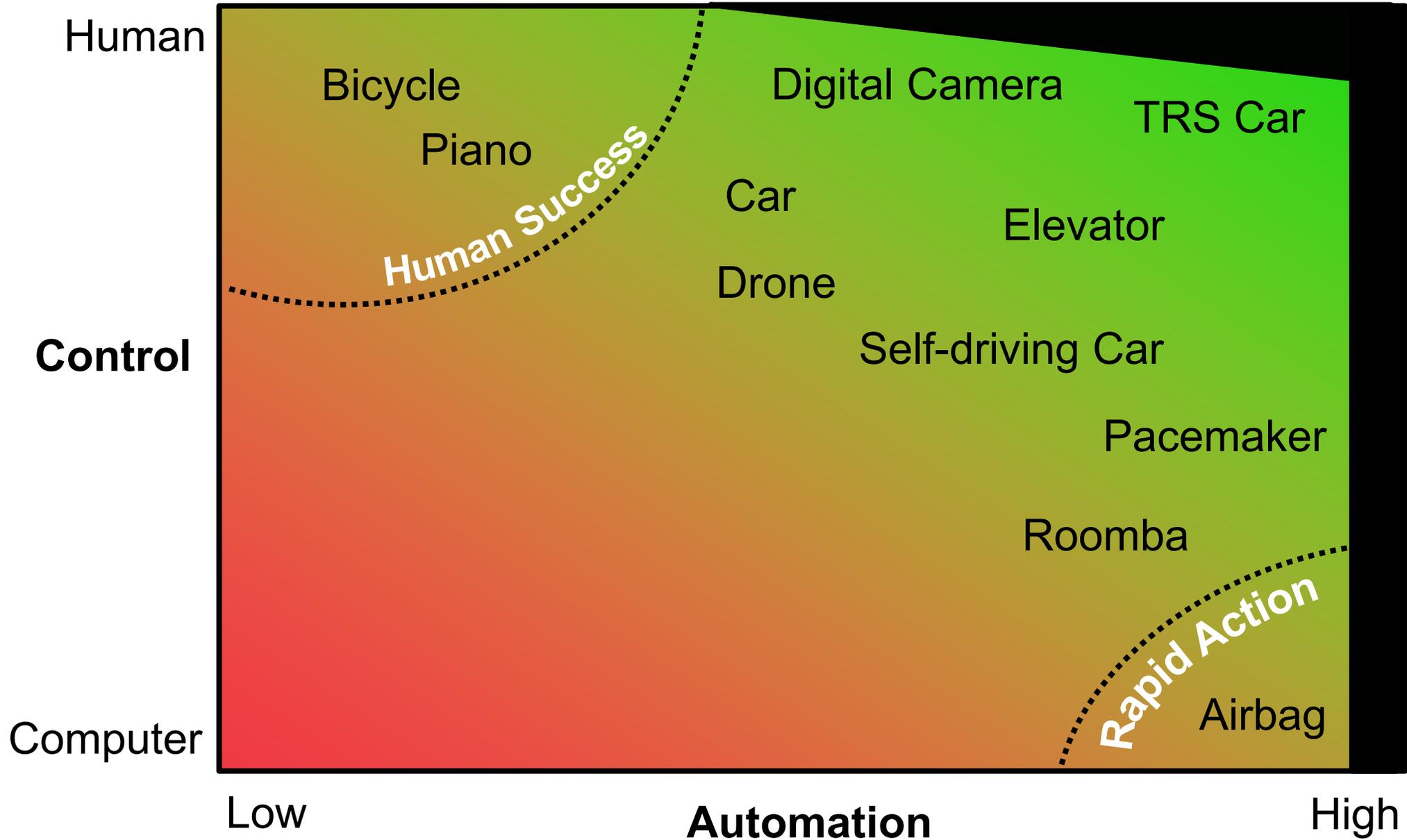
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# **Take Away Message**

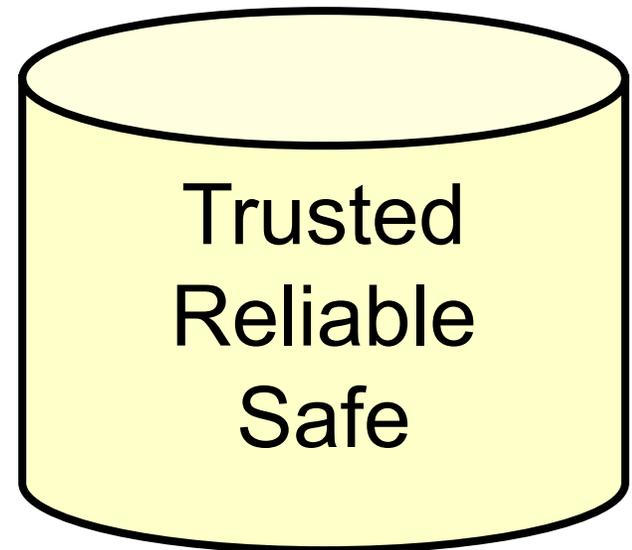
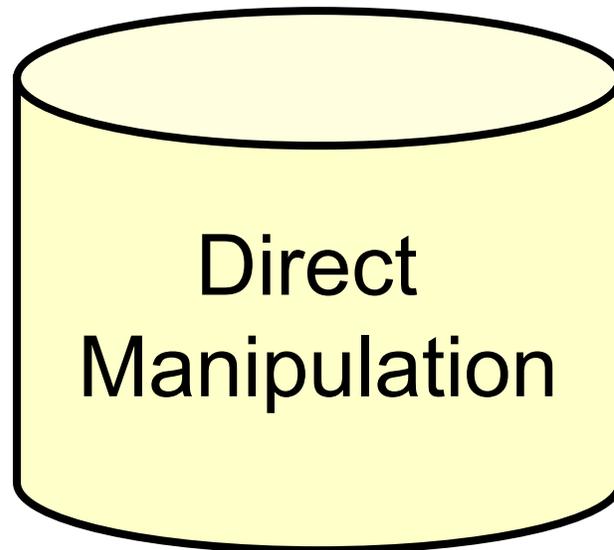
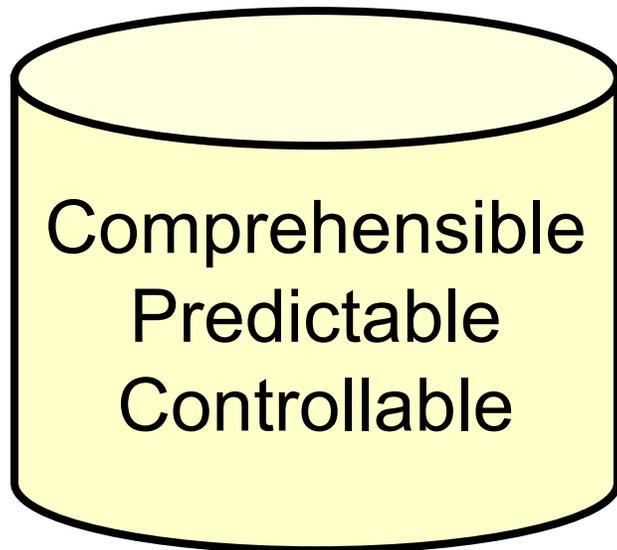
**Goal: High level of human control & automation**

- TRS: Trusted, Reliable & Safe**
- Comprehensible, predictable & controllable**
- Continuous display of status**
- Informative feedback**



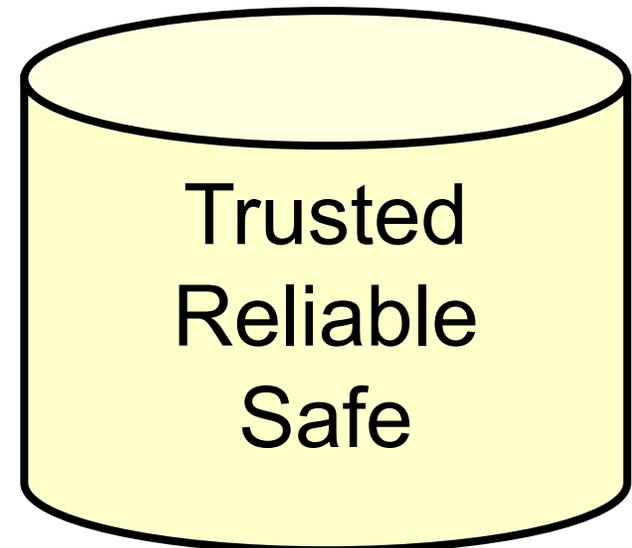
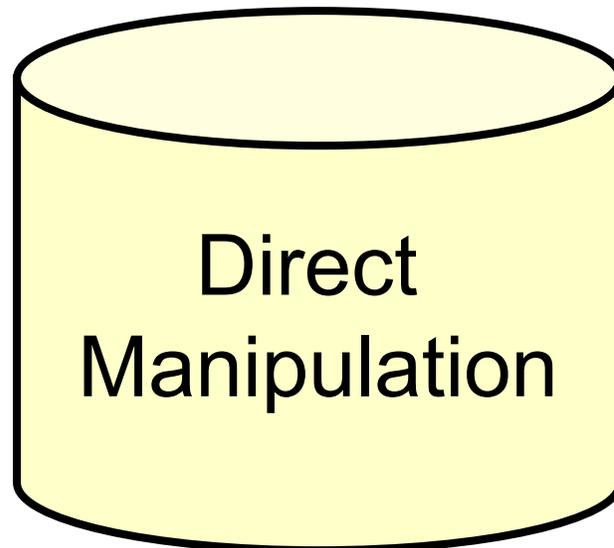
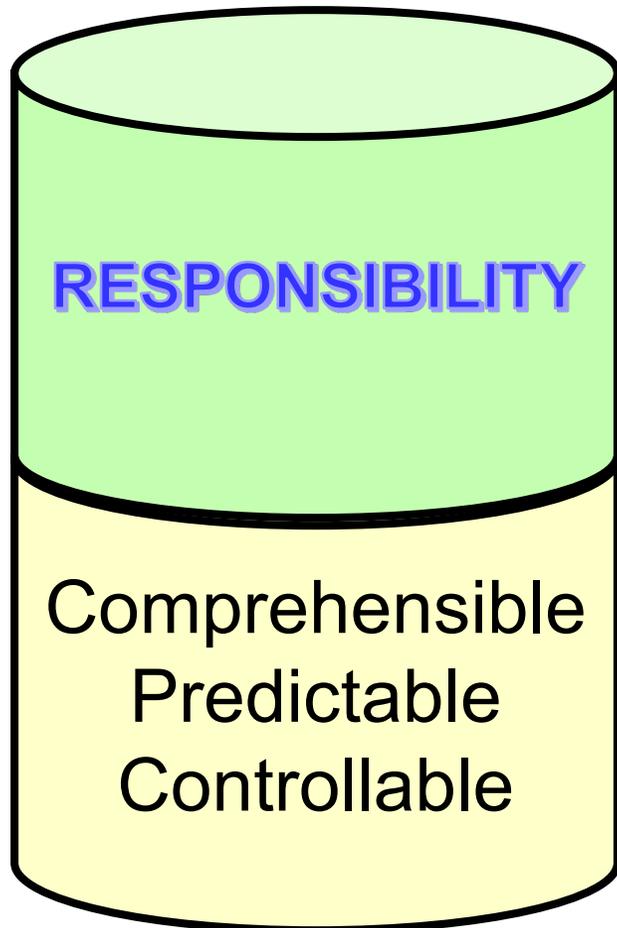
# Design Principles

# for Powerful Tools



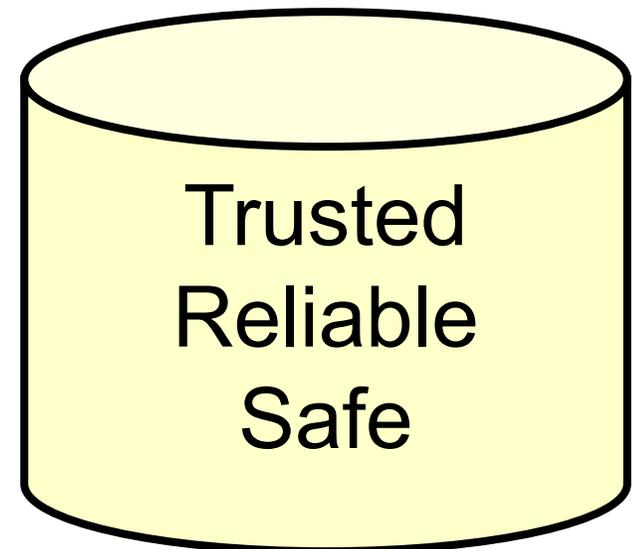
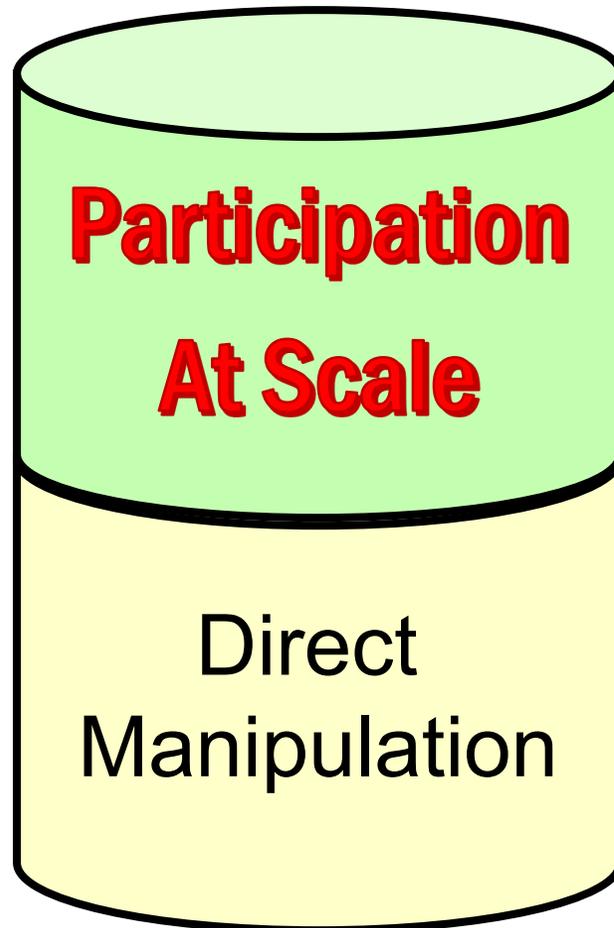
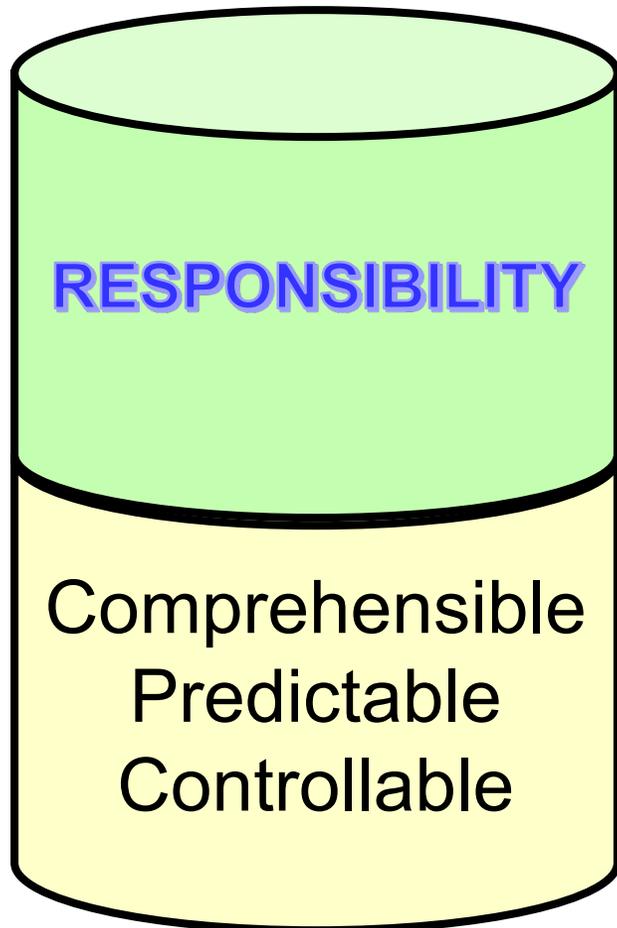
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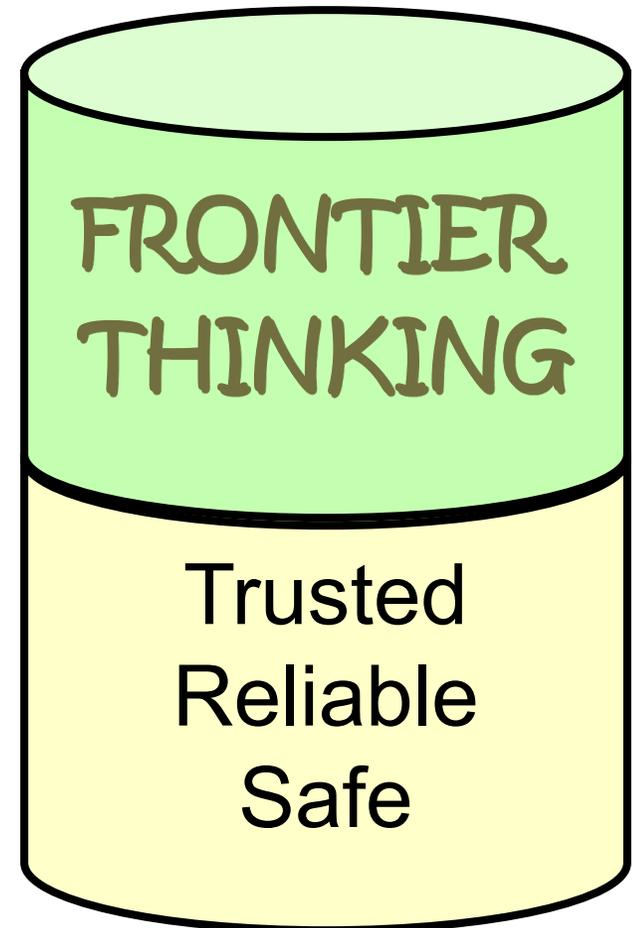
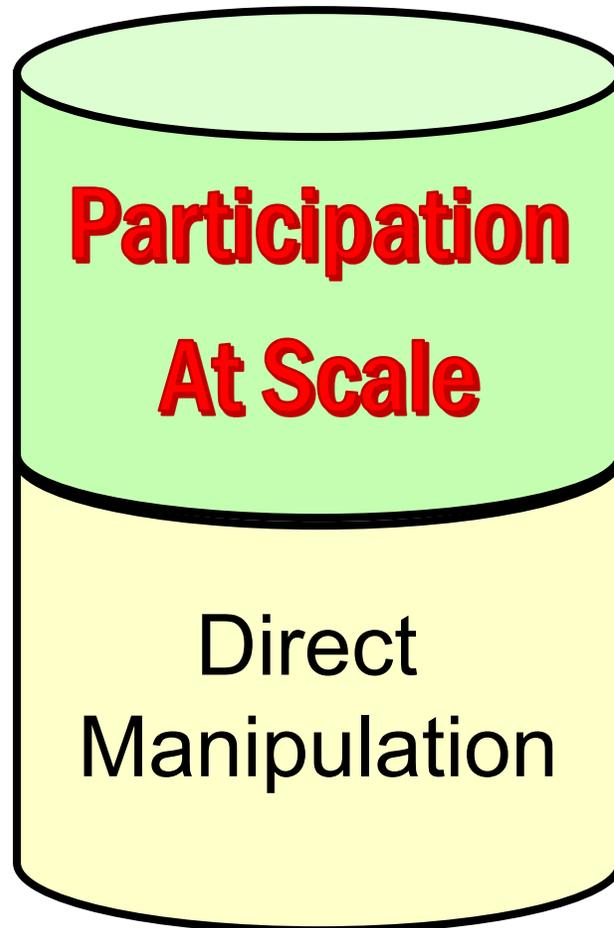
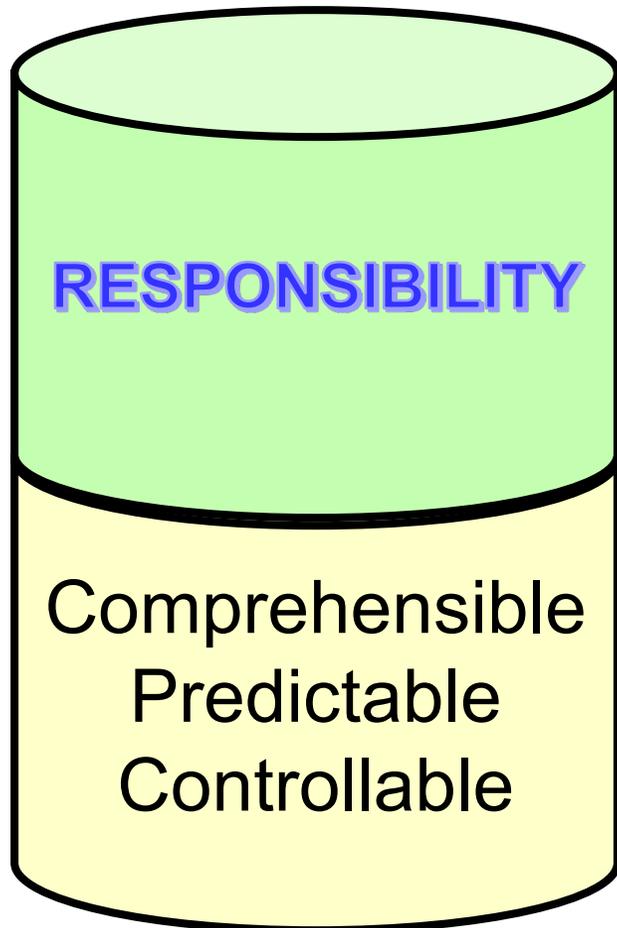
# Design Principles

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# Design Principles

# for Powerful Tools

More people, more creative, more often

**RESPONSIBILITY**

Comprehensible  
Predictable  
Controllable

**Participation  
At Scale**

Direct  
Manipulation

FRONTIER  
THINKING

Trusted  
Reliable  
Safe

# Design Principles

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**Self efficacy & Societal benefits**

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- **Audit trails to review failures & near misses**
- **Benchmark tests for verification & validation**
- **Continuous improvement & process monitoring**
- **Data quality & bias testing**

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Seek culture of safety by independent oversight

- Government regulation
- Insurance companies require standards
- Accounting firms audit systems
- Voluntary industry plans: Partnership on AI
- Professional societies promote education & ethics

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**Community, Cooperation, Collaboration, Contribution,  
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Innocentive, Kickstarter, GoFundMe, Open Science,...  
Citizen science, Community safety, Medical advice, ....

# FRONTIER THINKING

## **Human creativity pushes past the frontier**

Steam Ship → Diesel Train → Gasoline Engine  
→ Electric Cars → TRS Cars → ???

Computers → Local Area Networks → Internet  
→ WWW → Social Media → ???

Mainframe Programs → Desktop Applications  
→ Websites → Mobile Apps → ???

# FRONTIER THINKING

Assembly Language → FORTRAN → C → C++

→ Java → Python → ???

Microscope → X-Ray → MRI → CAT Scan

→ Sonogram → PET Scan → ???

Daguerrotype → Tintype → Kodak Camera

→ Polaroid Camera → SLR → Digital Camera



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- ↓ Humanoid robots fade as superior designs appear
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↑ Clarifying **Responsibility** accelerates quality

↑ **Participation at Scale** delivers beneficial outcomes

↑ **Frontier Thinking** enables breakthrough innovation

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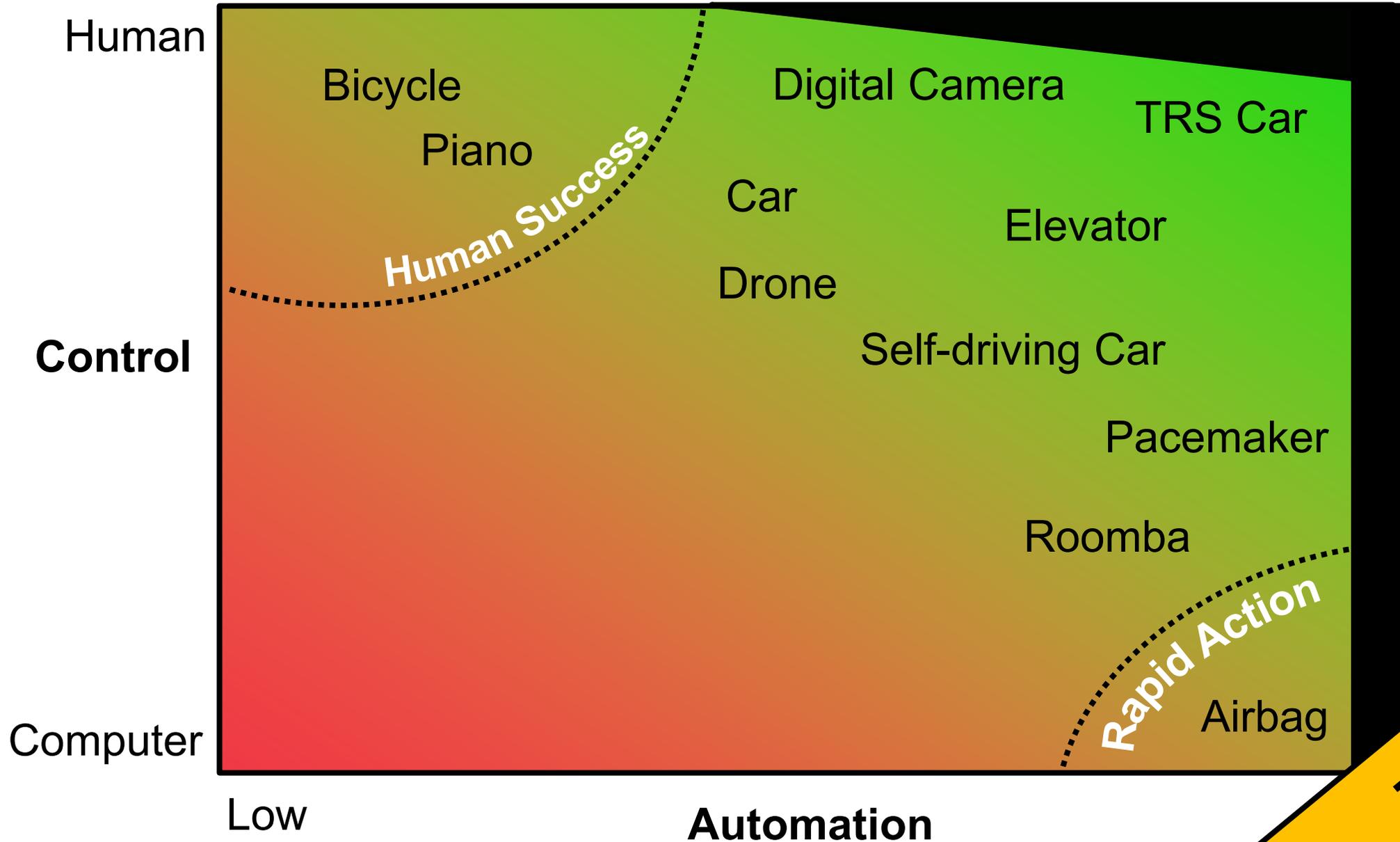
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# Landscape of Automation



**Thank You!**

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