

## Class 1

The adaptive universe

- finite resources
- surprise is fundamental
- change never stops

terrain → trans-disciplinary  
complexity  
adaptation

biological  
engineered  
human

quest: to identify fundamental rules that govern the adaptive universe

blows mind of western civ  
can't simplify our way out of adaptive universe

2nd aspect → engineering

can we guarantee appropriate forms of resilience: adaptive capacity

Systems that serve human purposes

Complexity, adaptation, resilience

System

↳ degrees definition

system of interest

"System" is a label → an act by an outside analyst to draw a boundary where there are some entities/processes/functions inside the boundary

outside → the env't, provides context

Self-driving car example

there is no omniscient view,  
it's a fiction

3 things that define sys perspective

1. behavior of system is function of interactions of parts/components that make up the system.  
(and what emerges from those)  
properties

Can't be seen in parts in isolation

2 interactions across scales  
more than 1 scale

to understand:

choose a scale  
broader + narrower scales impact it

always multi-Scale.

interactions occur from scales above  
below

3. What is a system is a matter  
of perspective of the analyst who  
chooses the boundary

When you look at the adaptive  
universe, it's about stories

complexity - can't hide from it

fcs.  
eng  
def'n → networks with increasingly extensive  
+ hidden interdependencies

Every perspective reveals and obscures

Always have to shift/contrast perspectives

network: set of interacting entities,  
processes + functions

tangled, layered network (TLN)

↳ John Doyle

## unit of adaptive behavior (UAB)

- nodes      tactics, strategies, resources, activities
- can adjust<sup>n</sup> their <sup>n</sup>behavior in face of variability/uncertainty

### adaptive capacity

ability to adjust in the face of events to regulate processes relative to targets/constraints

skill: adapt behavior in changing circumstances to achieve goal

two varieties of adaptive capacity

human system: system that serves human purposes

- people

- roles

- groups of people

- machines

} Examples

Unintended consequences offset gains

will look at stories (see quiver notes for  
setting, antagonists etc.)

unintended consequences is not a law, it's  
a symptom of complexity

graceful extensibility

sustained adaptability

Case: NASA Columbia

1999 NASA had 3 space exploration  
failure

safety

culture: independent perspective when things go  
wrong (safety investigation)

March 13, 2003 investigation

increasingly brittle system

acute fast/better/cheaper (FBC)  
pressure

FBC made system more brittle

brittleness - behavior of a system when it gets near its boundary conditions  
↳ rapid performance degradation

all systems

- finite resources
- constant changes

contrast: graceful degradation

brittleness is opposite of resilience

NASA: Design for Safety program  
(see quiver)

↳ Need to treat risk along w/cost + schedule

in 2000

Woods said: risk won't work, it's reactive. Need pro-active: resilience,

faster, better, cheaper; it's not "pick 2", pressure for all 3 is omnipresent

/ thorough (vs. efficient acute)

Safety is a chronic goal

resilience: extra investment

tradeoff: building resilience vs pursuing optimality

you have to do both

→ be more and more optimal

→ handle surprise

Columbia: three things outside boundaries

1. energy magnitude of debris strikes

2. base of flight (?)

3. striking leading edge structure, not normal  
tilted surfaces

FBC: rationalize away outside boundary  
"everything's normal"

Resilience Eng book (2006)

## Tradeoffs

acute vs chronic (goals)

efficiency vs thoroughness (plans)

optimality vs brittleness (complex systems)  
resilience

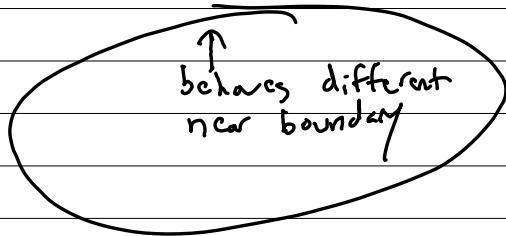
Optimist: You can be better/worse in  
tradeoff space

adaptive capacity is the potential for  
future adaptive action

how well can you handle the next event  
when it's not the same as the last  
event

you see resilience in orgs w/tangible  
experiences w/surprise

Surprise has to be part of it.



want architecture that can continue to  
find good tradeoffs even when surprises  
change

sustained adaptability

this course  
chart adaptive cycles based on  
stories

(Flash Boys book)

adaptive fluorescence

(Sounds like punctuated equilibrium)  
evolution in bio happens in fits & starts

## Lecture 2

Assumptions of adaptive universe

1. Finite resources

2. The world doesn't stop changing

3 different tradeoffs

1. acute - chronic (short run vs long run)
2. efficiency - thoroughness (Hollnagel)
3. robust - fragile  
(optimality) (brittleness)



John Doyle - control theory (CalTech)

Alderson et<sup>s</sup> (robust yet fragile)

(including robustness)

In pursuing optimality, increases  
brittleness

systems seems to be getting faster/better/  
cheaper,  
but becomes more vulnerable to  
collapses

pessimist: Collapses are inevitable

optimist: can outmaneuver complexity

# Big picture

1. adaptive histories
2. precarious present
3. resilient future

1. empirical - what happens in adaptive cycles? regularities, patterns, descriptive, explanations
2. assess where things stand
  - systems are more precarious than we think
  - different units in our tangled, layered network have models
  - those models can be wrong
3. action agenda

## Images of resilience + brittleness in action

Platform drilling collapse in Brazil

- even richest orgs on earth feel pressure to cut costs

## Drone Failure

## Emergency medical system (resilience)

## Case 1: anaesthesia case

Cook & Woods, anaesthesiology

surgical plan, anaesthesia team

surgeon expects little blood loss  
short procedure

attending asks for extra lines.

anesthesiologist

why?

attending anticipating problems ahead,  
bottleneck\*

take action  
in advance directs resident to do extra work, to  
handle case where crisis arises in future

resident accepts surgical plan at face value  
attending physician has additional context info

Expertise: ability to anticipate bottlenecks  
ahead + take actions to prepare

players: anaesthesia team ← <sup>resident</sup> attending  
Surgical team  
patient conditions

opportunities for variation to occur

units, levels in TLN  
what's the unit?  
network?

competence envelope

graceful extensibility - how to handle surprise  
at the boundaries of  
the plan

not about frequency

noting what kind of surprise could arise?

ideas + principles have to work at different scales

Case 2: anaesthesia care

(resilience in action: anticipating trouble ahead)

- anaesthesiology gotten much safer over last 15 yrs
- production + financial pressures
- moving more surgeries to outpatient

Setting: operating in a network w/  
extensive, hidden deps

Antagonist: linear thinking

Story: Escaping & failing to escape  
Simplifications

Driver: Surprises & Cascades

Tensions: Dramatic failures in  
Brittle Systems

Dead Ends: Unintended Consequences

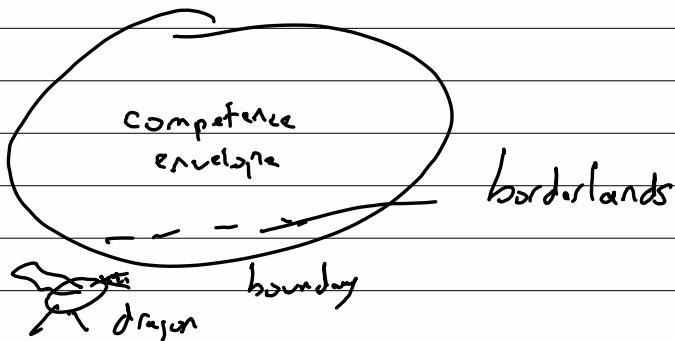
Hope: Where People Stretch to  
Outmaneuver Complexity

Forward: Graceful Extensibility and  
Sustained Adaptability

## Class 3

Charting adaptive cycles

Competence envelope



Surprise

1. anticipating how we might get Crunchy/squeezed
2. generating readiness to respond

preparing to be surprised

## Competence envelope

Perspective 1: work to rule/role

## borderlands

Perspective 2: handling surprises regularly

fluency law: "well"-adapted activity occurs with a facility that belies the difficulty of the demands resolved and the dilemmas balanced.

adaptations hide what was adapted

competence envelope continually expands

model surprise is always possible

optimizing within the competence envelope always makes you more brittle in the borderlands

- it is necessary/good to pursue optimality
- brittleness is separate, at the boundary

Net adaptive value: joint fn of

- ↳ graceful extensibility
- ↳ optimality

trade-off

Change leads to shortfalls  
responsible ppl make up for shortfalls

4 Senses paper

- rebound

- robust

- graceful extensibility vs brittleness

- sustained adaptability

↳ search for architectures that adopt  
in the trade-off space

Adaptive cycles: studies of resilience in action  
charting how changes reverberate thru multi-role,  
multi-echelon networks  
each response to change by some unit triggers  
adaptive responses across other units

stalls  $\xleftarrow{\text{reverb}}$  florescence

↳ change in one unit opens up  
new possibilities in other  
units

reverberation across a Tangled Layered Network of interdependent units:

the degree that changes in one area tend to recruit or open up beneficial changes in many other aspects of the network; which opens up new opportunities across the network

59:30 L3 pressing need intersects w/ (apparently) powerful  
Capability

- point of change reverberates thru network
- experience of adaptive shortfall (brittleness)
- responsible ppl act as generic adaptive + learning stop-gap to fill shortfall
- resulting in kludges (workaround costs)
- new opportunities for innovation
- adaptive fluorescence

### Underground adaptations paper

- look at points of change (new tech, org change)
- shadow chart - invent new artifacts
  - unofficial
  - supportive work tool
  - more value than official tool
  - new artifact failed to support flexibility

- another case:

underestimated coordination demands

mismatch: computerization  $\begin{cases} \text{helps @ low workloads} \\ \text{(hurts @ high workloads)} \end{cases}$

tradeoffs intensity with load

Case: Being Bumpable (Cook)  
short story incident w/ICU

We need to do charts (charting adaptive cycles)

ICU as crossroads  
can be overloaded  
have to move patients out

resource saturation  
varying & fluctuating demand

regulate system w/buffer to avoid saturation  
capacity to maneuver

## Class 4

### Adaptive cycles

anticipating crunches

3 ways that adaptive systems break down  
fail

how do systems stretch at boundaries?

Surprise is normal

Saturation - run out of capacity

capacity for maneuver (CFM)

risk of saturation or CFM

case: urban firefighting

tangled, layered network

- variety of roles

- distributed in space & time

- tangible experience w/surprise

- multiple goals

- interdependencies

(See quiver notes for slides)

Decomplementation (discuss later) → exhaust capacity to adapt

Desynchronization

- teams are no longer coordinated

3 breakdowns

- 1. Decomplementation
- 2. Working at cross purposes
- 3. Getting stuck in outdated behaviors

- risks
- 1. complexities in time → decompensation
  - 2. complexities over scales → working at cross purposes
  - 3. complexities in learning → getting stuck

challenges grow + cascade faster than we can respond

pacing / tempo

practice crises

locally adaptive, globally maladaptive

### Cross purposes

- fragmentation (silos)
- missing side effects of change (temporal)

### Complexities in learning

every good controller is a model of the system  
being controlled



- pursuing targets in the face of variation
- there are limits on the model
- model surprise
- learning loops

world changes, but system stuck in what were previously adoptive strategies.

proactive learning vs getting stuck

- oversimplification

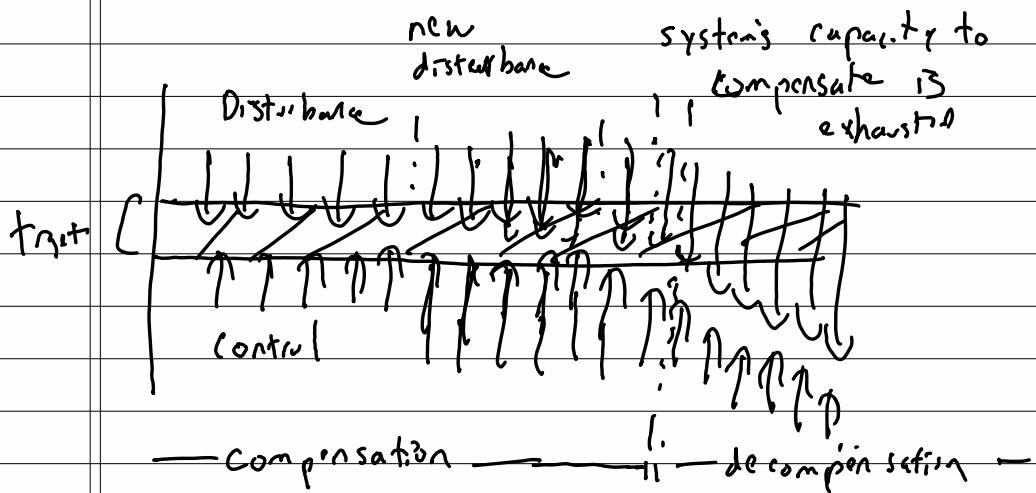
- fixation

### Decomposition

- going solid

breakdown occurs when challenges grow + cascade faster than responses can be decided on + deployed to effect

time → how do things cascade

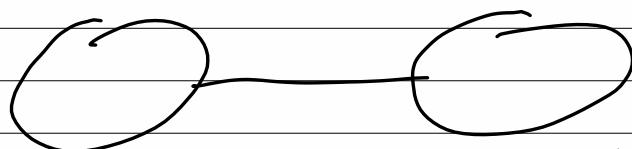


monitor: how hard we are working to stay in control

oversimplifications

\*\*\* Capacity for Maneuver (CFM)

- cushion of potential actions + additional resources that allows system to continue functioning despite unexpected demands



one unit increasing its CFM might decrease another unit's CFM

CfM: controlling risk of saturation  
critical parameter for control  
anticipation

good control being able to anticipate  
there are singularities of what happens at a  
- Cascades

CfM: can measure that now

sustained adaptability

anticipate vs decompensate  
synchronize across units vs work at cross purposes  
roles, levels, proactive learning) vs stuck in stale behaviors  
before failures

## Ten theorems of adaptive universe

1. Adaptive capacity is finite

(boundaries are universal)

Corollary

1.1 The boundaries on the range of adaptive behavior can be fixed or elastic

1.2 A variety of concepts about adaptive capacity can be collapsed into the single parameter Capacity for Maneuver (CFM)

2. Events will produce demands that challenge boundaries on the adaptive capacity of any UAB

2.1 The location of boundaries relative to demands is uncertain

2.2 There are recurring patterns about surprise

2.3 Brittleness is operationally defined as the risk of saturating CFM

3. Adaptive capacities are regulated to manage the risk of saturating CfM

4.

Class 5

1. Boundaries are univrs.)

2. Surprise occurs

multiple goals, and they conflict  
- how to align?

|| adaptive units

↳ uses its knowledge + capabilities to adjust its behavior in changing circumstances in pursuit of goals

human systems are:

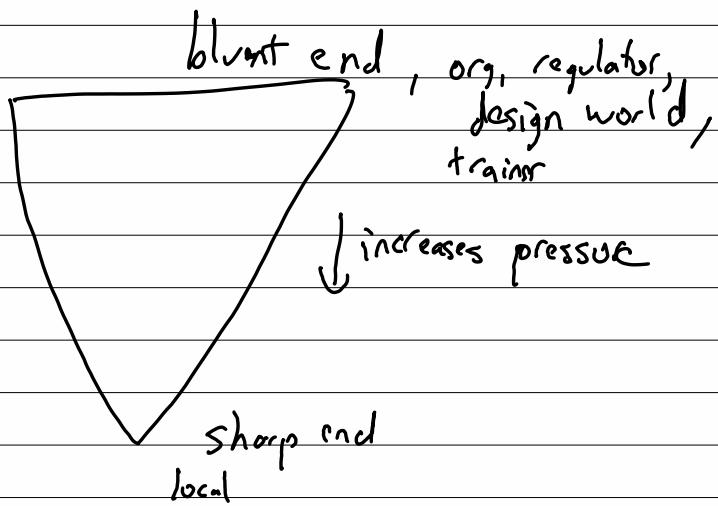
- intentional (have goals) themselves

- reflective (have a model of "how they work")

how goals interact + conflict  
seeking alignment

Today: working at cross-purposes

UABs responsible for goals  
experience consequences of success/failure



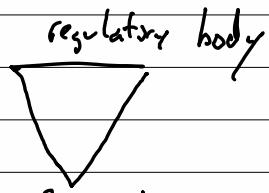
polycentric governance

tragedy of the commons ('68)

- common pool resource (e.g. fishery)
- individual unit behavior affects global system
- pressure on individual agents to fish more
- feedback loop: fish decline, individuals have pressure to fish harder
- fish decompensate: collapse  
(tipping point?)

Ostrom: ppl generally find a different way out of the tragedy

### Polycentric governance



- multiple centers
- each partial authority / autonomy
- partial responsibility
- command structure → flows down
  - increases risk of decompensation
  - tends not to work (gaming)
- limits on going fully flat
- polycentric in between { command hierarchy  
fully decentralized }
- polycentric range
- good architecture is a dynamic control mechanism
- Balinese water temple example
  - unintended consequences of western intervention
  - post outbreaks
- military doctrine (Napoleonic)
  - flexible polycentric architecture

58:49

Van Klauswirth - polycentric  
adapt plan to fit the situation

initiative, coordination across levels critical

Polycentric governance

- network of interdependent units operating over different ranges
- strategy for
  - empower decentralized initiative
  - coordinate over emerging trends to meet priorities
  - dynamic interplay as situations evolve + as other units adapt

emergency informatics: social media, fires in SoCal

patterns from patient boarding study

- boarding resources → ~~first breakdown~~

mismanagement of TLN

Ostrom's reciprocity - need reciprocity in TEN  
"I will help you when you're crunched"

work to role undermines <sup>coordination</sup> ~~synchronization~~  
globally maladaptive

need to incentivize working across roles

responsibility to achieve local goals  
that's what you want  
adaptive simultaneously  
all systems are well-adapted  
and  
all are mal-adapted  
under-adapted

bio: can select for adaptability, potential for future  
Adaptive action when the world changes

## Class 6

precarious present - assessment  
3 forms of breakdown  
decompensation - anticipatio  
cross purposes - locally adaptive  
tragedy of commons - polycentric governance  
~~stakeholder~~ eco

coordinate synchronize  
learn proactive

stuck in stale models

net adaptive value: how we do

- far from boundary

- near boundary risk saturation  
high

## charting adaptive cycles

1. pick a trigger  
acute, immediate, slowly building  
anomalous?  
opportunity?  
bottleneck
2. who does trigger affect? (what units)  
~~what does it~~:  
who reacts to it?  
who notices it?  
what does it mean for that role/UA?  
role/org

how did they change?

Treat each adaptive unit response as a trigger. How does that look?

looking at waves of change

foreground/background

↳ unit

eventually stalls out, stops triggering change

analysis pattern

3 panel poster

1. initial adaptive cycle

2. reverberations triggered by that

3. what does that lead to?

(could have subplots)

adaptive landscape

basics in theorems

3 \* adaptive capacities can be regulated

- recognize risk of saturation
- adjust capacity to maneuver
- how hard is it to stay in control?
- struggle for fitness is ongoing

4. No UAB can have sufficient range of adaptive behavior to regulate risk of saturation by itself

- have to look at network

## Example: heart as adaptive unit (UAB)

- Some UABs can monitor + regulate CfM of other UABs in response to changes in the risk of saturation

Seawall

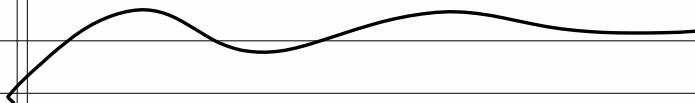
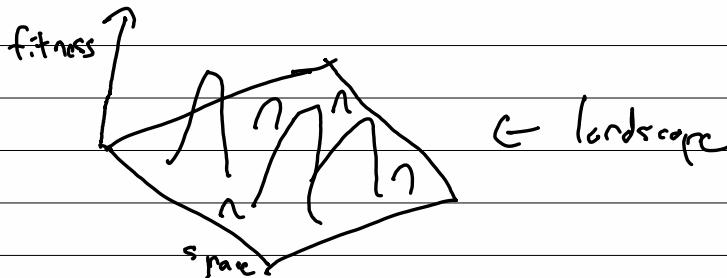
~~seawall~~

Wright, 1932, adaptive landscape (~~genes~~ paper?)

2D topology w/ height  $\rightarrow$  fitness  
"adaptive value"

genetics talk Sixth Int'l Congress of genetics

Darwin's finches - beaks adapted to food on local island



## Decompensation

fitness: ability to stay on target

all units have bounds, can saturate

Can I keep up w/change?  
how much margin is left?

- (mutuality)
  - changing demands in unit
  - units have capabilities to respond to demands
- (relationship)

Readiness to:

Display existing

Mobilize new

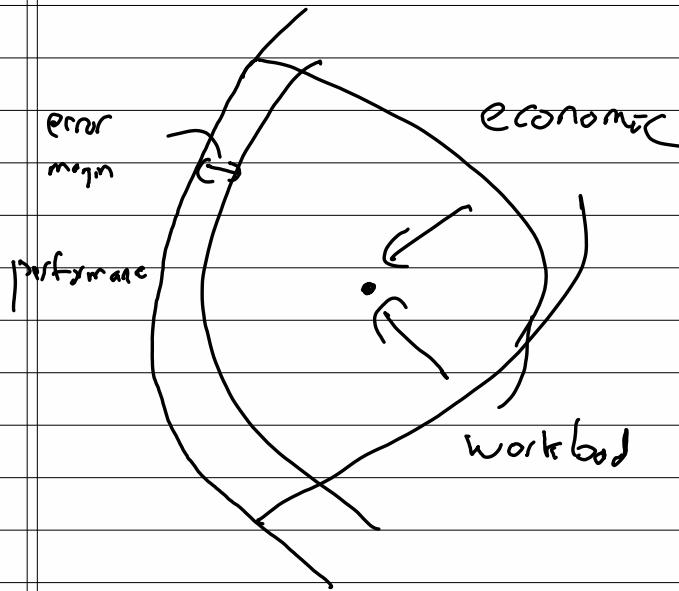
Generate ~ (the future)  
new

getting stuck + stale  
2 kinds of learning

- change your base envelope/fitness

- how graceful extensibility is created  
how do we stretch at boundary

## Safety margin-boundary diagram



metaphor (turns out it's wrong)

not correct (don't have "surprise is normal")

tend to think competence envelope bigger  
than really is

Overconfident  
miscalibrated

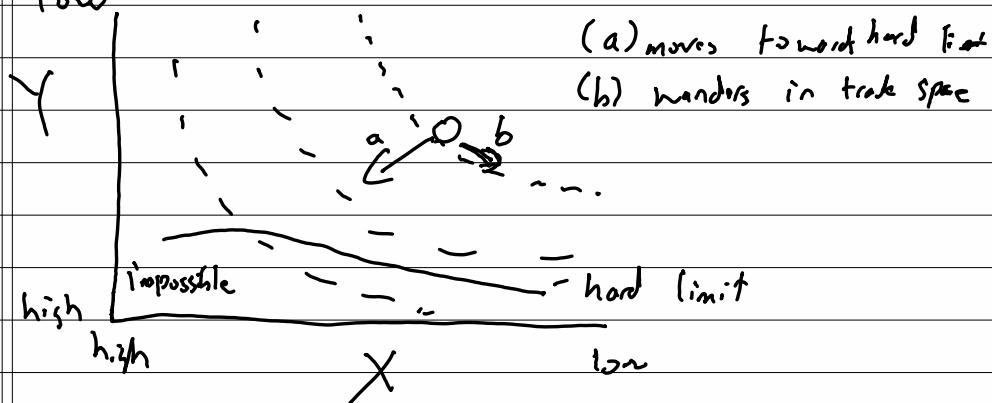
## Class 7

Key concept of today: tradeoffs  
will go over adaptive cycle example

Key idea: actual adaptive cycles

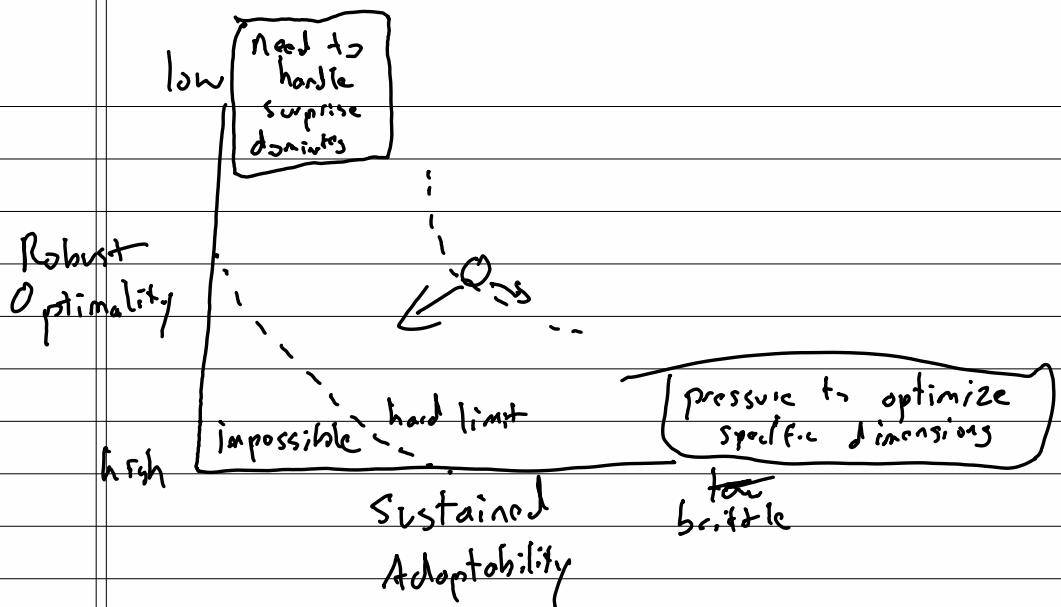
how to draw trade-offs

low



### Fundamental tradeoffs

- optimality - brittleness (Doyle)
- acute - chronic, FBC pressure (Woods)
- efficiency - thoroughness (Tolbaek)
- bounds on perspective (Woods)



Many refers to Doyle here  
he is looking for architecture

### 5 tradeoffs

- fitness vs resilience
- plans vs thoroughness
- effectivity vs distributed
- local vs distant views
- acute vs chronic goals

when pressure/ load is low, lots of good operating points, easy to find them

As load goes up, harder to find good operating points.

### Case of drones

1. adaptive fluorescence - extending human reach
2. experience of adaptive shortfalls  
(need 170 ppl per drone in 90s)
3. responsible ppl act as adaptive + learning stop-gaps largest work-arounds in history of computer technologies  
(extreme kludges)

### Law of stretched systems

every system is continuously stretched to operate at capacity

## Lecture 9

Thm 10: you ~~overes~~ think your model  
is better than it is

Thm 9: individual perspectives are limited

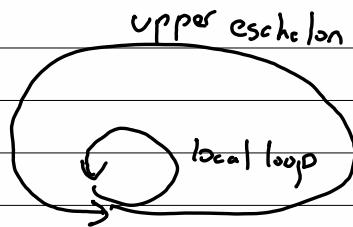
If we can stand down the service, then  
we can temporarily relax constraints  
(block dragons of surprise)

planes → don't let fly when weather bad  
hospital → can't stand down  
(e.r.)

humans: we adapt how we adapt

Confidence that we have no confidence

You can monitor how hard you're working  
to stay in control



monitor successes  
& difficulties on  
staying in control

Then G. adopting how you adapt

- (didn't capture all those)

Algorithm cannot be a unit "adaptive behaviors  
- until it's connected to the world  
- unless it has graceful extensibility

people are unmodelled, generic reserve of  
graceful extensibility

automation → autonomy

ML won't save us  
actuator saturation

## Places where this works

1. - tangible experience w/surprise<sup>n</sup>  
↳ recognizes decomps is a risk
2. unease about how precarious they are
3. push initiative down  
empower local behavior
4. reciprocity → sync work across units of adaptive<sup>n</sup>
5. work to align goals across multiple units

1:28:26

Rules of the architecture  
polycentric governance

## Lecture 10

John Doyle

graceful extensibility  
sustained adaptability

architecture

key point: surprise is about preparation

there are regularities about surprise

systems can be adapted to those regularities  
about surprise

need capabilities in advance

we can get better at building  
adaptive capacity

life cycle  
architectures

sustain adaptability over life cycles

Context of use will change  
b/c you are successful!

what arch will sustainability to change?  
sources of adaptability

### universal laws + architectures

universal "conservation laws"

graceful extensibility →

"constraints that deconstrain"  
- critical things in arch

(going over Doyle slides)

case study: transportation firm adapts  
to Hurricane Sandy

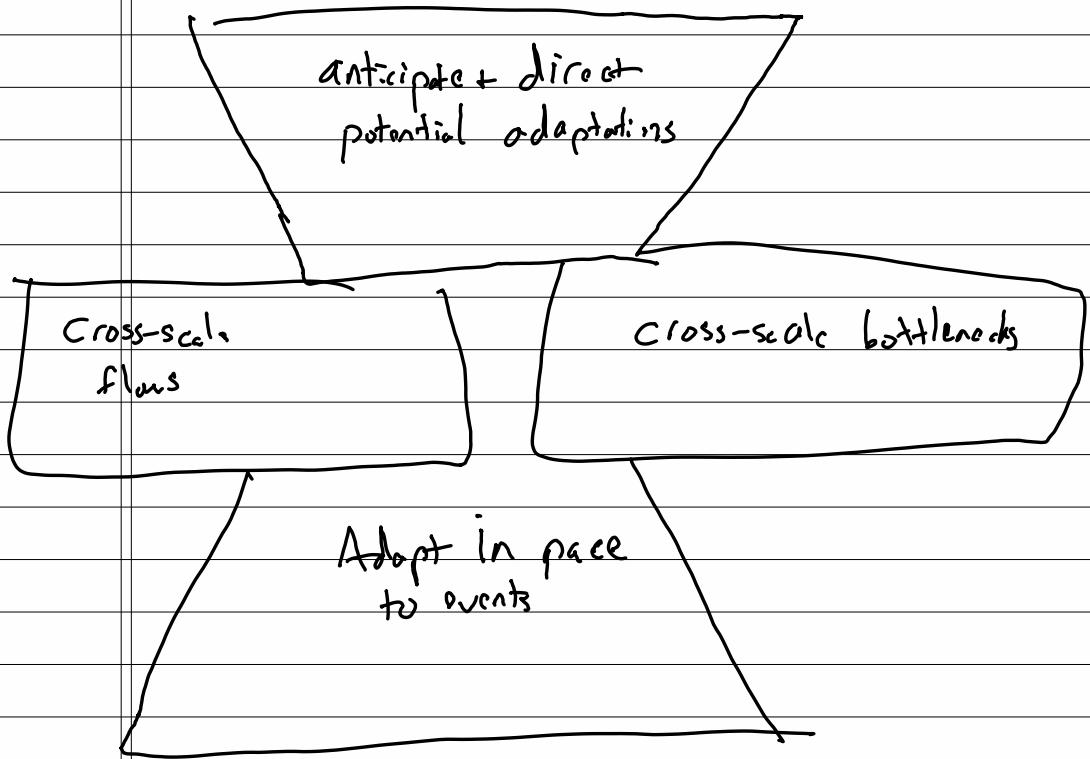
prepping for storm

value responsiveness over cost

no initiative → not a UAB

time matters

communication bottleneck



## class 12

Reaching resilience: releasing the adaptive power of human systems

telling a story of basic rules of adaptive universe

4

3 drivers of change & innovation

1. connectivity

2. sensors

3. automation/autonomy

4. people

human goals + expertise

law of unintended consequences  
regulatory change

tangled, layer networks

hidden interdependencies

surprising cascade of effects

Brad surprised by how other units reacted to introduction of ITEX

adaptive behavior consume success

everything keeps changing

17:52 & pressure points  
surprising reverberations

All about load / pressure

how they change under pressure

fastor/better/cheaper<sup>only</sup> → more brittle

not adaptive value

anticipating bottlenecks ahead

the world will surprise you

can you recognize dragons?

rebound

linear

simplifications

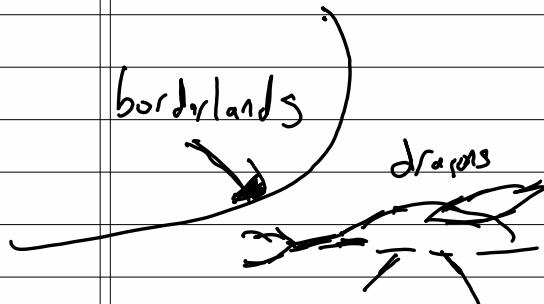
robust

adaptive

universe

graceful extensibility

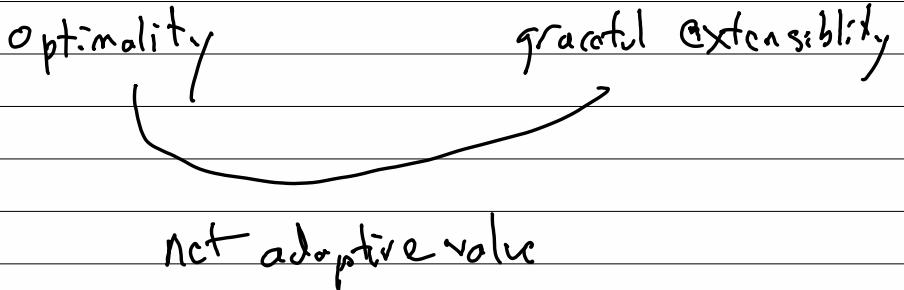
sustained adaptability



Decomposition  
Working at cross purposes  
stuck in stuck

Anticipation  
Synchronizing over units  
proactive learning

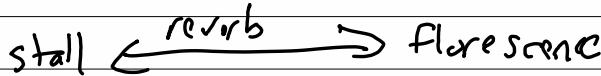
Cascades, frictions, changing temps



### Charting cycles of adaptations

adaptive cycles: charting how changes reverberate thru networks

- each response to change by some unit triggers adaptive responses across other units



innovation as fluorescence

law of stretched systems

10 theorems

bio sphere: they draw adaptive landscape

1:26:20 Matching process

2 regions



deploy / mobilize / generate

Brad builds team w/generative qualities

- high initiative
- strong personalities, complementary
- diverse set of experiences + backgrounds
- open to exchanging info → adjusting model
- 

had to generate adaptive capacity

equilibrium

- temporary state
- doesn't mean anything

2 kinds of learning

1. adjust competence envelope

2. graceful extensibility

↳ tilting toward florescence

heuristics: tilting toward florescence

1. when surprise is normal

- practice + simulation when don't see dragons that often

Otto von Bismarck: I prefer to learn from other's experience

2. unlease precarious

3. human talent - empower local initiative  
circumscribed.

Coordinated

upper echelons:

- monitor how well handling things

- reinforcing error areas of success

- filling in gaps in order to achieve higher-level goals

4. invest in graceful extensibility

- jet engines in air hardly ever fail  
vs engines on the ground

reserve needs to be effective force

5. reciprocity - you will help me out  
when I'm in trouble

Is it safe to simplify?

Can pretend world is linear, but it's  
pretending

opposite of complexity is not  
simplicity

need to be able to maneuver  
graceful extensibility

4 drivers of TLTs

1. connectivity

2. sensors

3. automation / autonomy

4. people

Strange loop

discussion of digital services

heart example

faults / load, goal conflict / cascades

adaptive universe: you power it

adaptive

leverage ↑ power of human systems