# Taking self-governance from data to model to design

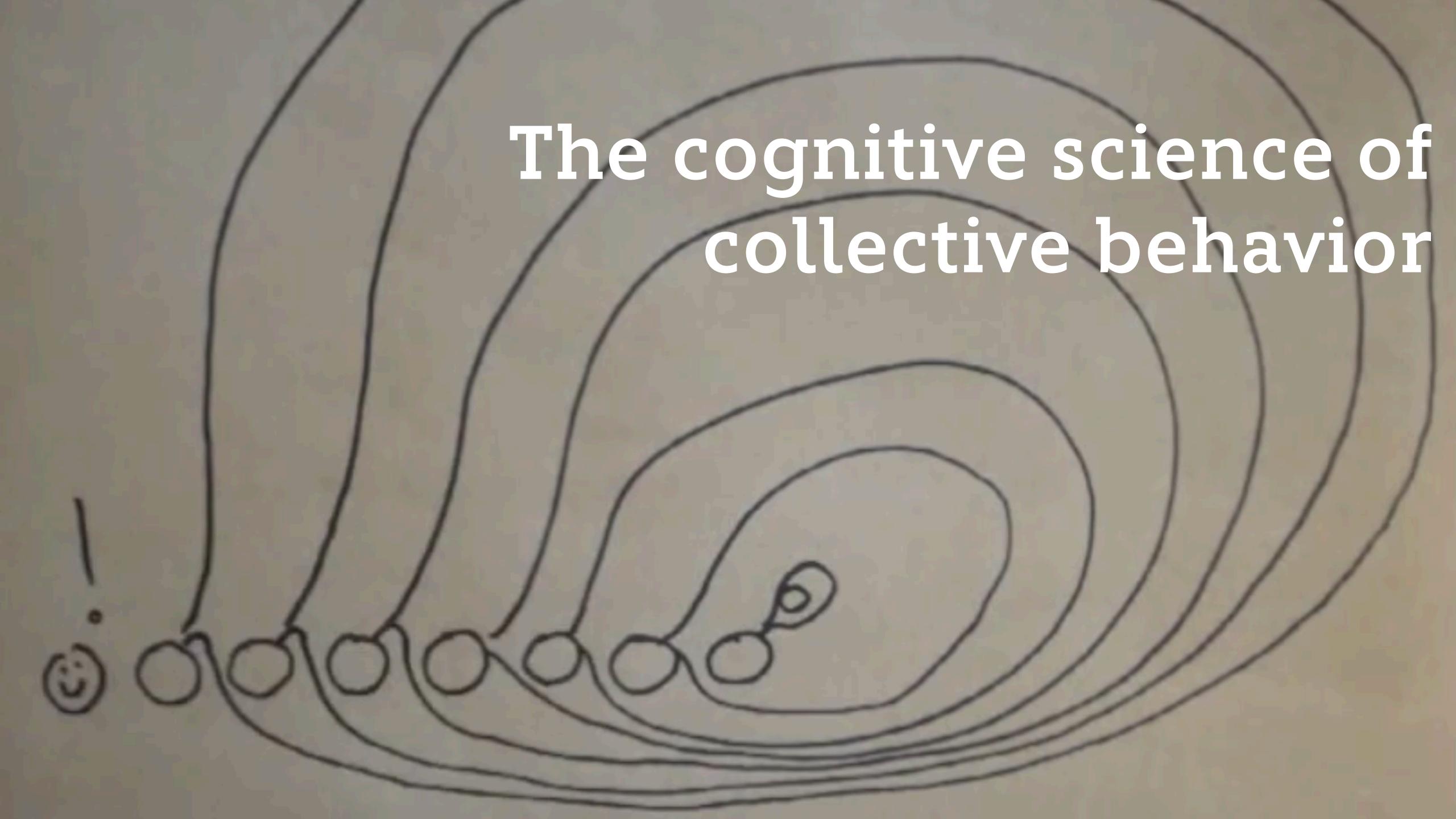
**Seth Frey** 

Communication, University of California, Davis

The Topos Institute Colloquium 2024 09 26













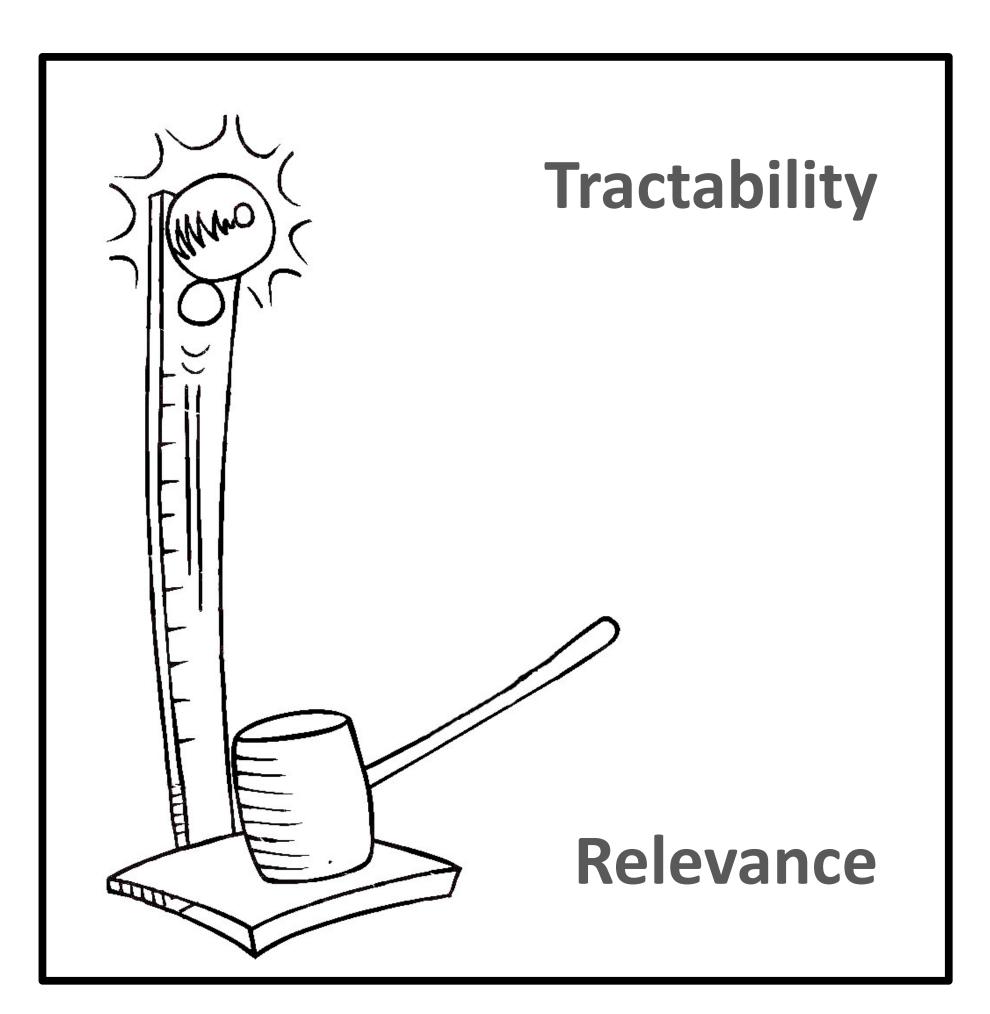
LEARN TO TIE YOUR SHOES LEARN TO READ AND WRITE LEARN TO RUN A TEAM HOLD SPACE MANAGE TIME PLAN AN EVENT LEAD A MEETING START A PROJECT FULFILL YOUR DUTY TO BUILD A GOMMUNITY

## Arc

- Empirics (data science)
- Simulation
- Design

#### Multiple methods for strong claims

Formal modeling Simulation Cognitive modeling Lab experiment Field/Web experiment Big data Daily experience



#### Multiple complementary methods

"But how do you explain it?"

"Did you control for these things?"

"But correlation isn't causation."

"That's just speculation."

Models

(Theories)

**Lab Experiments** 

Web/Field Experiments

Observational datasets (Surveys, "big data")

**Daily experiences** 

"Its totally artificial."

"Its too general."

"Your assumptions are unrealistic."

"But the lab is so artificial."

"Have you tried ...?"

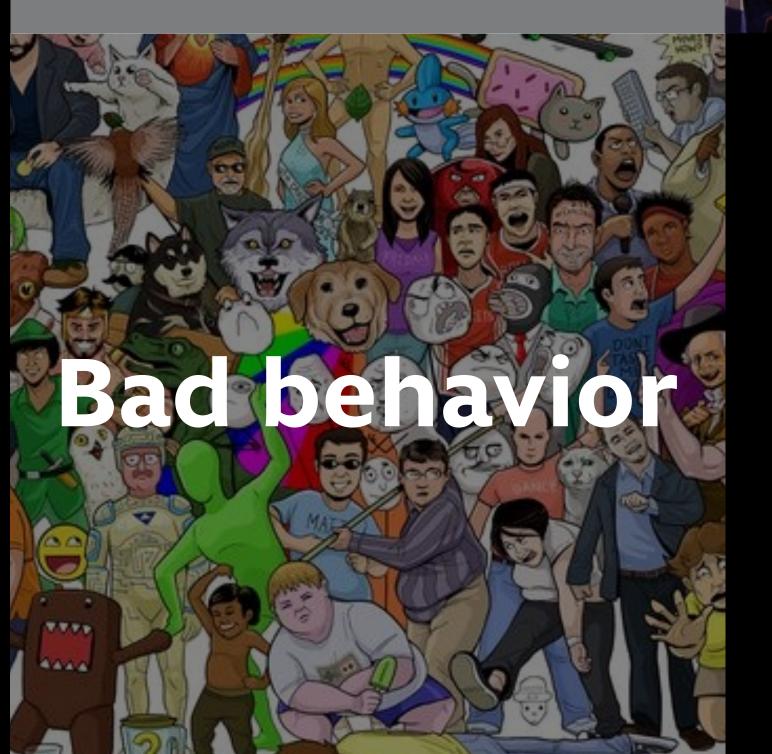
"Does it scale?"

"What's the real-world relevance?"

"But how will this help me?"



# Participatory media 665



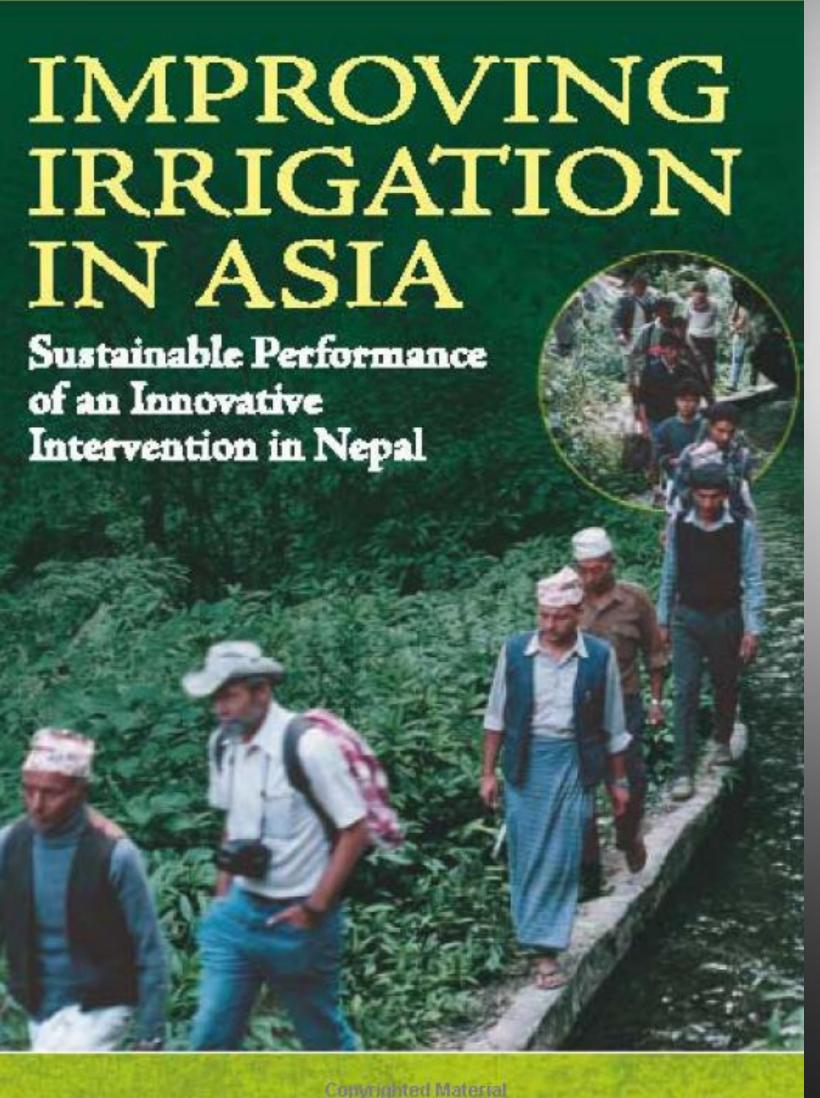


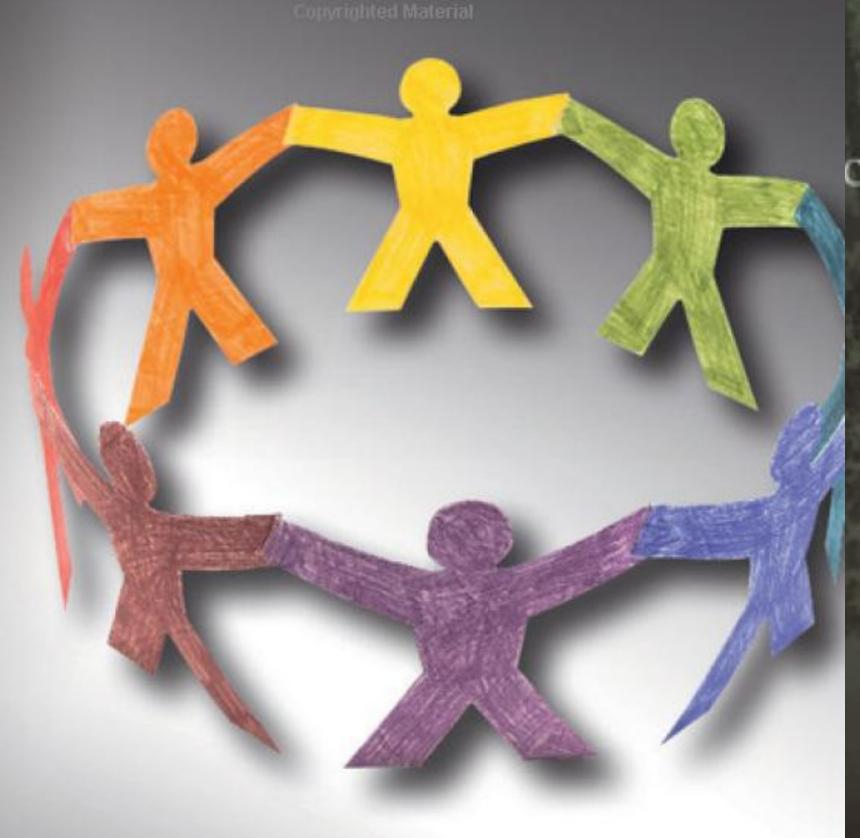


Also
CPU/RAM
hacking
moderation
attention
network congestion

ELINOR OSTROM
WAI FUNG LAM
PRACHANDA PRADHAN
GANESH P. SHIVAKOTI





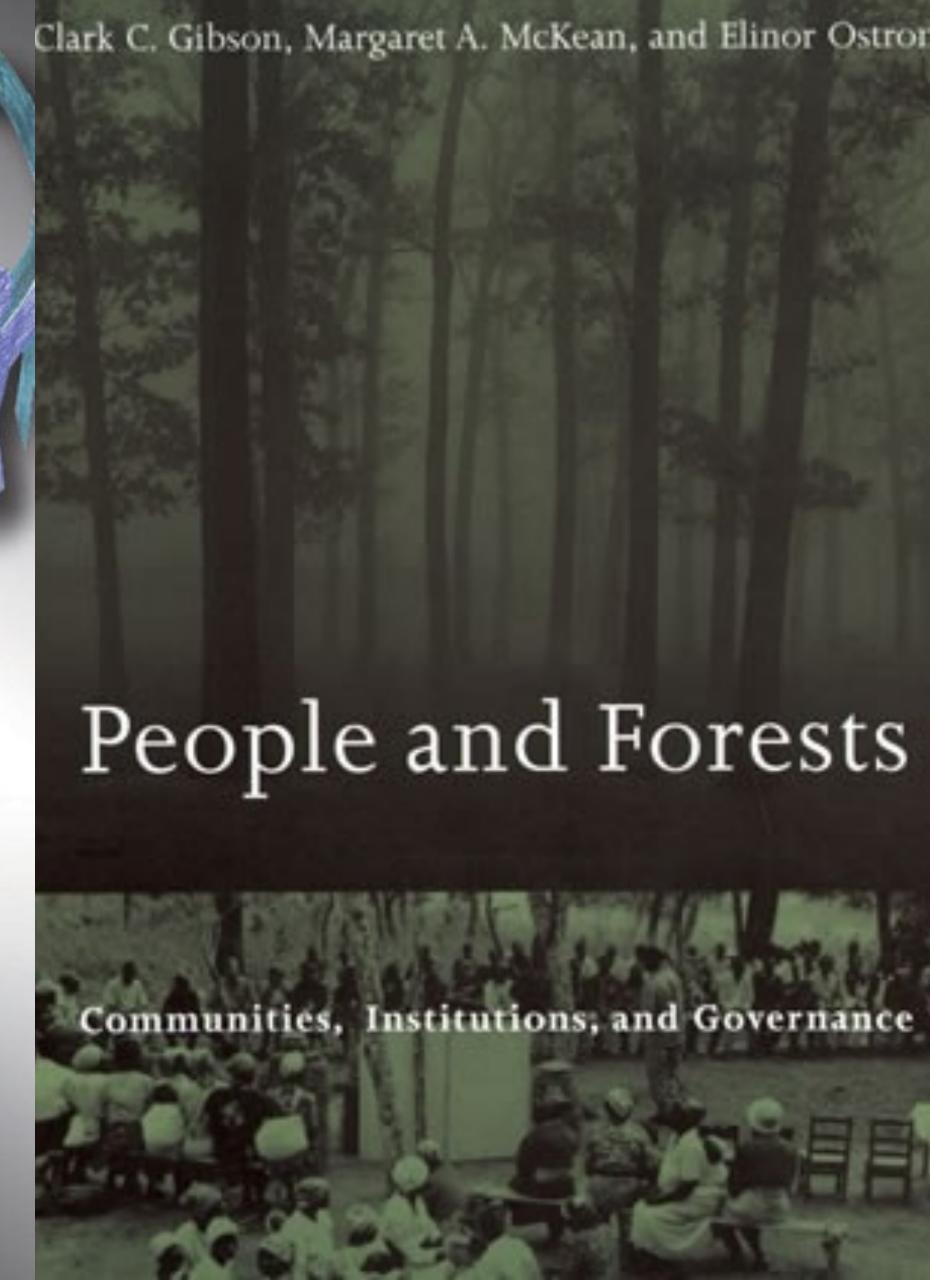


## Elinor Ostrom

# Governing the Commons

The Evolution of Institutions for Collective Action

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Frey S, Sumner RW (2019)
Emergence of integrated institutions in a large population of self-governing communities.
PLoS ONE 14(7): e0216335.
http://doi.org/c76k

WITH ONLINE COMMUNITIES COMPUTATIONAL SOCIAL SCIENTISTS CAN TEST GENERAL PRINCIPLES OF INSTITUTION DESIGN AND PERFORMANCE

# The model organism

- "Online behavior isn't real"
- "Lessons from online don't transfer"
- "Structure of online communities is specific to the Internet"

# The model organism

- Drosophila melanogaster for gene expression
- Mus musculus for medicine
- Online communities for institutional and organizational processes

## The core unit

- Cell biologists study many cells.
- Psychologists study many individuals
- Why doesn't a social scientist primarily study many societies?

# Why online communities?

(or other "engineered social systems")

- "Societal" Unit of Analysis
- "Real" "people"
- Simplified environment
- Multi-level data (Individual-, Social-, Pop-)
- General enough
- High Motivation
- Clear Goals
- Selection on Performance

General enough

# The Wikipedias





#### r/TeensSupportTeens Rules

- 1. No NSFW Posts
- 2. Flair Yourself before Posting and Commenting
- 3. Remain Respectful of Others' Opinions
- 4. No Spamming
- 5. LGBT+ Safe Zone
- 6. No Suicide and Self-Harm Related Posts
- 7. No Repetitive Daily Posts
- 8. No Posting and Encouraging Drugs, Smoking, Alcohol, or Vaping

#### r/ModSupport Rules

1. No reporting rule violations or ban appeals

Please send all rule violations and appeals to us <u>via the appropriate report</u> <u>form</u>. Posts or comments reporting these topics may be removed.

2. No calling out other users or subreddits

Posts or comments calling out other users or subreddits may be removed. If you need to discuss something sensitive in nature about another user or community, please send a modmail to /r/ModSupport.

3. No insults or uncivil behavior

Please keep posts and comments free of personal attacks, insults, or other uncivil behavior.

4. No off-topic posts

#### r/Showerthoughts Rules

^

^

1. All content must be original and unique.

Submissions that match (or echo similar sentiments to) ideas offered by other people will be removed, regardless of whether or not those ideas have appeared on Reddit. Blatant reposting and plagiarism may result in a ban.»

2. All posts must be showerthoughts.

Personal perspectives, crazy ideas, questions (rhetorical or otherwise) and meta submissions are not showerthoughts, and would be better suited to other subreddits. For an indepth explanation of what a showerthought actually is (and is not), please read this page.

3. Your entire thought must be in the title.

You may include examples, explanations or further information in







Support

Changelogs

War Effort

Discord

WELCOME

How to connect

CREATE ACCOUNT

JOIN COMMUNITY

**ARMORY** 

Welcome

Information ~

Statistics

Become a part of the old Vanilla world. Set up your client according to our guide.

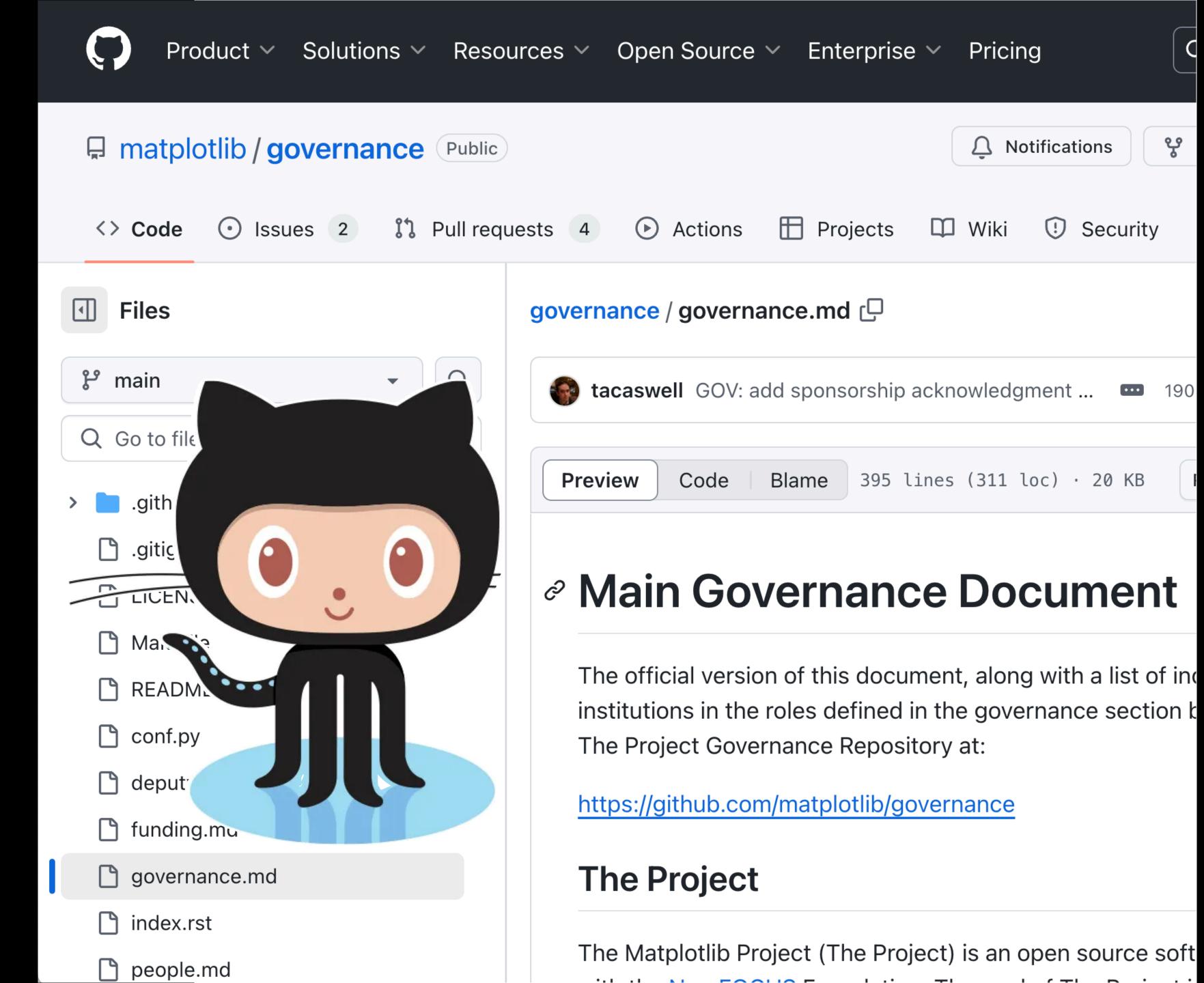
If you have any questions, read the FAQ first. In case you don't find the answer, you can try asking on our IRC.

Most our services are to be found on the web page of the **TwinStar** project, under which Kronos belongs.

https://www.kronos-wow.com/

HTTP Server	Commons	Gump	М	Portals	Т
Α	Community	Н	MADlib	Pulsar	Tapestry
Accumulo	Development	Hadoop	Mahout	Q	Tcl
ActiveMQ	Cordova	HAWQ	ManifoldCF	Qpid	Tez
Airavata	CouchDB	HBase	Maven	R	Thrift
Airflow	Creadur	Helix	Mesos	Ranger	Tika
Allura	cTAKES	Hive	MetaModel	Ratis	TinkerPop
Ambari	Curator	HttpComponents	MINA	REEF	Tomcat
Ant	CXF	Hudi	Mnemonic	River	TomEE
Any23	D	I	MyFaces	RocketMQ	Traffic Control
APISIX	Daffodil	Iceberg	Mynewt	Roller	Traffic Server
Archiva	DataFu	Ignite	Ν	Royale	Trafodion
Aries	DataSketches	Impala	NetBeans	Rya	Turbine
Arrow		Incubator	NiFi	S	TVM
AsterixD	pike	IoTDB	Nutch	Samza	U
Atlas	ory	Isis	0	Santuario	UIMA
Attic	ninScheduler =	J	OFBiz	Serf	Unomi
Avro		Jackrabbit	Olingo	ServiceComb	Usergrid
Axis	uid	J mes	0001	Se rice ix	V
	ubbo	juouds	C vzie	Shardir Sphere	VCL
Bahir /	E		ChenJPA	Sn o	Velocity
Beam	ECharts	J leter	O <sub>k</sub> anMeetings	SINGA	W
Bigtop	Empire-	hnzon	Open.	SIS	Web Services
Bloodhc	E	_Joshua	OpenOffice	SkyWalking	Whimsy
BookKee	Felix SOF	JSWikA R E	Dpe Verbeans	Aing ON	Wicket
Brooklyr	Fineract	jUDDI	OpenWhisk	Solr	X
Buildr	Flex -	<del>Jun</del> e a STABLI	SHED 1999	SparriAssassim	Xalan
BVal	Flink	K	Ozone	Spark	Xerces
C	Flume	Kafka	Р	Sqoop	XML Graphics
Calcite	Fluo	Karaf	Parquet	Steve	Y
Camel	FreeMarker	Kibble	PDFBox	Storm	Yetus
CarbonData	G	Knox	Perl	Streams	Z
Cassandra	Geode	Kudu	Petri	Struts	Zeppelin
Cayenne	Geronimo	Kylin	Phoenix	Submarine	ZooKeeper
Celix	Giraph	L	Pig	Subversion	•
Chemistry	Gobblin	Libcloud	Pivot	Superset	

Yin, L., Chakraborti,
M., Schweik, C.,
Frey, S. Filkov, V.
(2022), Open
Source Software
Sustainability:
Combining
Institutional
Analysis and SocioTechnical Networks,
ACM CSCW <a href="https://arxiv.org/abs/2203.03144">https://arxiv.org/abs/2203.03144</a>



Yan, Y., Frey, S.,

Governance File

MSR23data-98

https://doi.org/

Dataset MSR2023

Yin, L. (2023)

GitHub OSS

Data & Tool

Showcase

kvm4

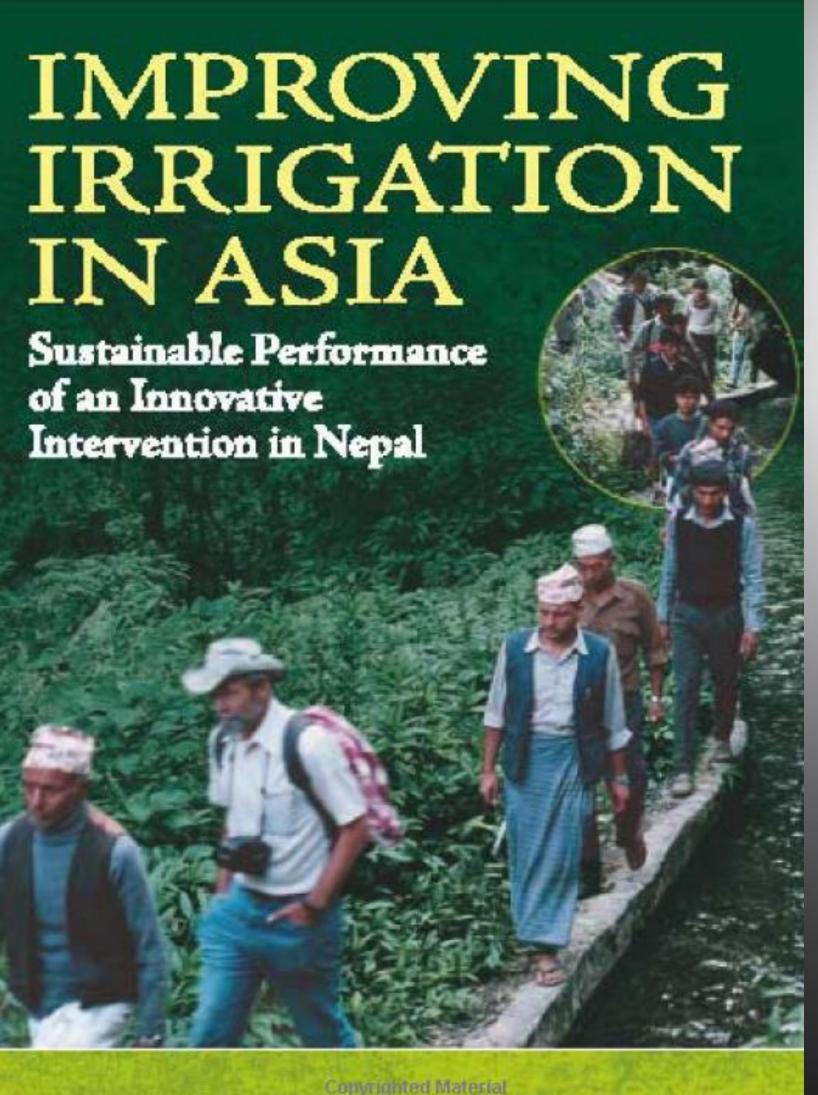
Zhang A., Filkov, V.,

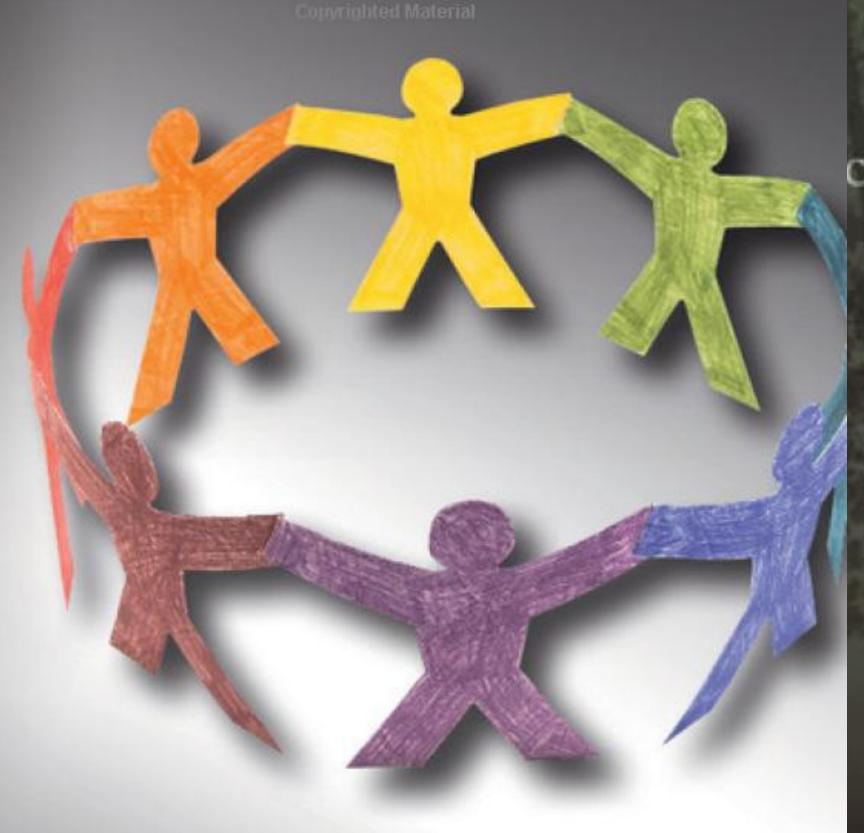
# What do all these have in common?

## Commons

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PRACHANDA PRADHAN
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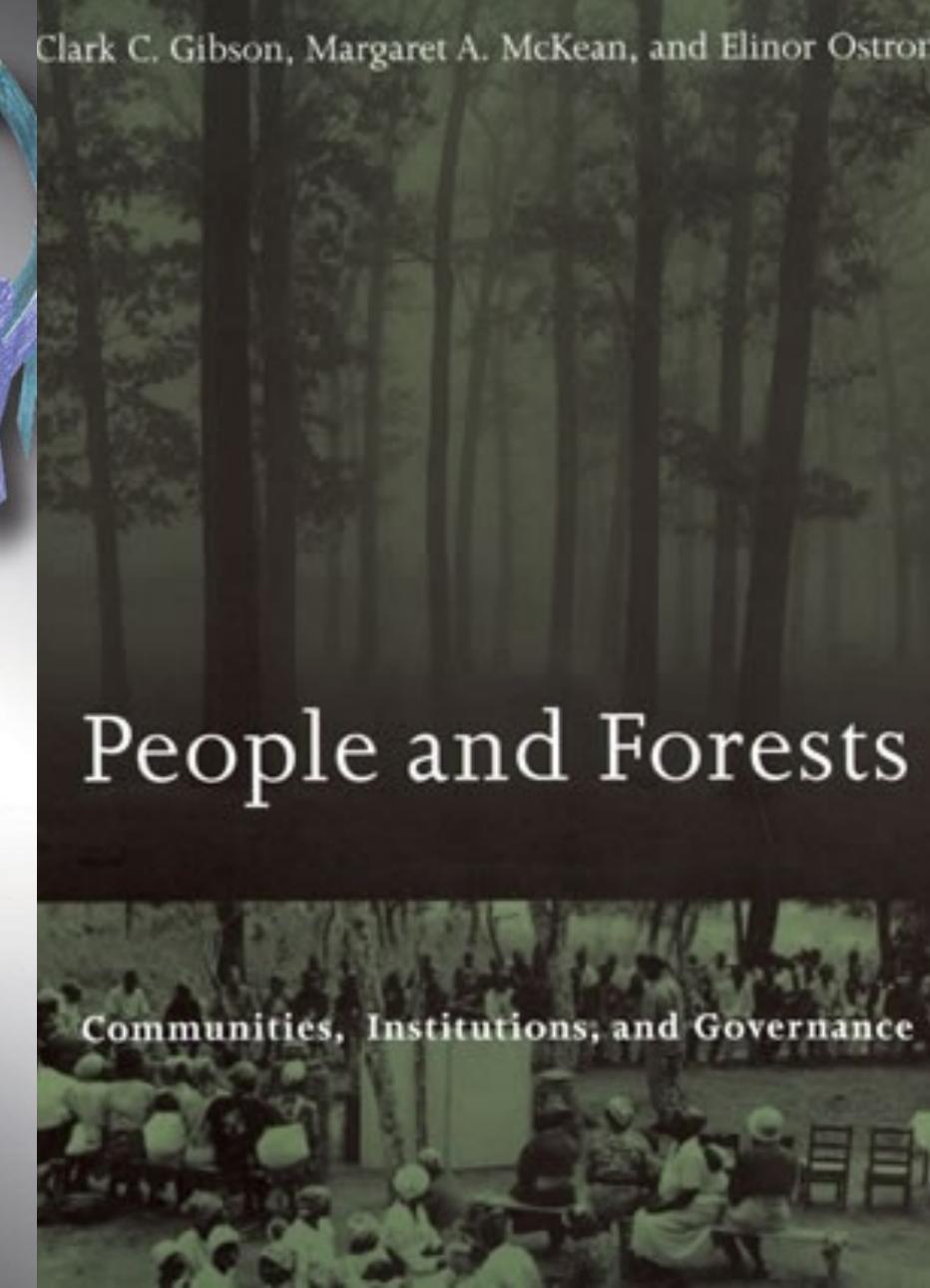


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# Projects

- What governance systems do communities design for themselves and what works with Bob Sumner
- Is governance change due to selection or drift? with Qiankun Zhong and Martin Hilbert
- "Do we run how we say we run" with Mahasweta Chakraborti
- What are the varieties of polycentricity? with Shagun Jhaver and Amy Zhang
- Institutional preferences with Ofer, Nori, Dalton, and Qiankun Zhong
- The psychological mechanisms of the tragedy of the commons with Christopher Frantz
- Composing games into complex institutions with Hedges,
   Tan, Zahn
  - NLP4GOV with Mahasweta Chakraborti

# Projects

Minecraft

Minecraft

Apache Software Foundation

12 platforms

Model and experiments

ABM

Formal framework

- What governance systems do communities design for themselves and what works with Bob Sumner
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  Zhong
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   Tan, Zahn

Toolkit — NLP4GOV with Mahasweta Chakraborti

# Each a different framework

# Projects

Minecraft

Minecraft

Apache Software Foundation

12 platforms

Model and experiments

ABM

Formal framework

— What governance systems do communities design for themselves and what works with Bob Sumner

- Is governance change due to selection or drift? with Qiankun Zhong and Martin Hilbert
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Toolkit — NLP4GOV with Mahasweta Chakraborti

# Integrated Institutions in a Large Population of Self-Governing Communities

**Seth Frey** 

Communication, University of California, Davis

Frey S, Sumner RW (2019)
Emergence of integrated institutions
in a large population of selfgoverning communities. PLoS ONE
14(7): e0216335. http://doi.org/c76k

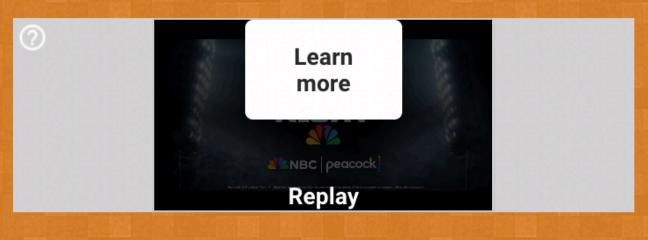












Want a better Minecraft server? Read about SpigotMC here!

Forums -Home ▼

**Resources** 

Wiki ▼

Team ▼

**Downloads ▼** 

Discord

Hub Issues Donate

Sign up Log in

Q

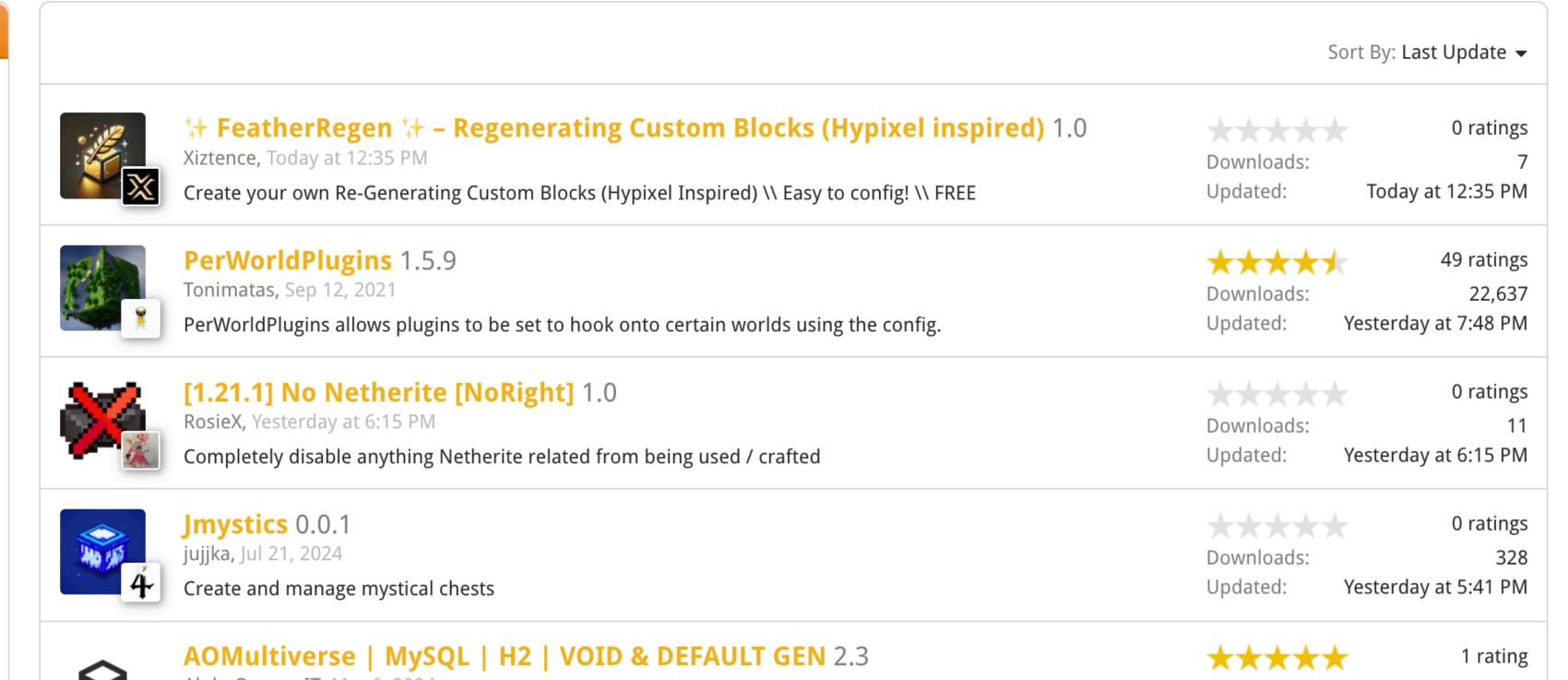
Search...

Home > Resources > Spigot



#### World Management

<b>CATEGORIES</b>	
Bungee - Spigot	7,196
Bungee - Proxy	2,747
Spigot	65,886
Chat	5,561
Tools and Utilities	16,985
Misc	3,737
Fun	8,547
<b>World Management</b>	1,701
Mechanics	4,650
Economy	1,473
Game Mode	1,336
Skript	9,756
Libraries / APIs	1,403
No Rating	0
Standalone	115
Universal	462



# A few Minecraft governance plugins

- Communication
  - Vault, Dynmap, Skype,
     AutoMessage,
     SimpleBroadcast
- Enforcement
  - Bounties, autobans
- Monitoring
  - LogBlock, LWC
- Private property creation
  - Lockette, Townies,ProtectionStones
- Common property creation
  - Whitelists, factions
- Public goods provisioning
  - BuyCraft, Enjin,GAListener, EchoPet

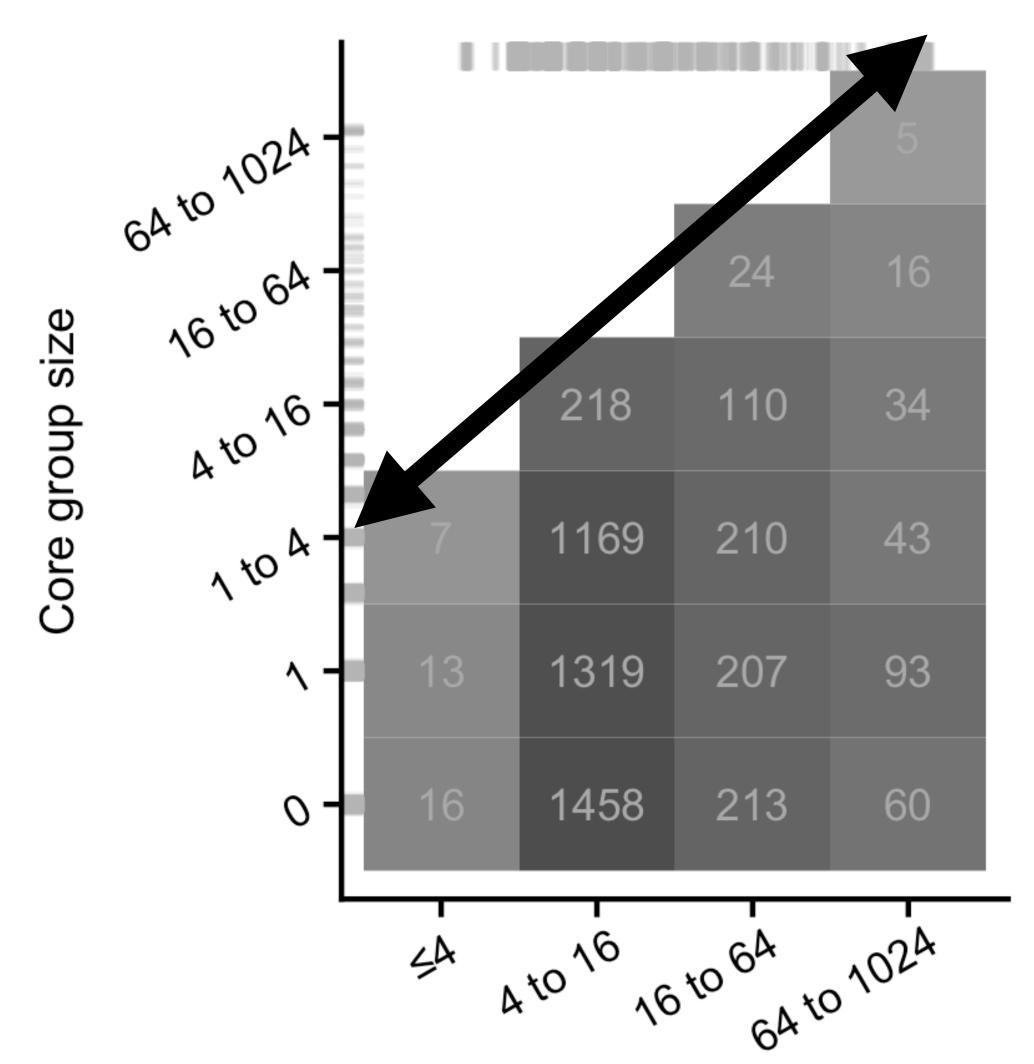
- Grief prevention
  - WorldGuard,
     PermissionsEx, LWC,
     GriefPrevention
- Grief remediation
  - WorldEdit, CoreProtect
- Entropy management
  - Essentials,Server.properties,WorldBorder
- Hierarchy
  - GroupManager, Nations
- Economies
  - iConomy, ChestShop,SignShop, GUIShop

### Results

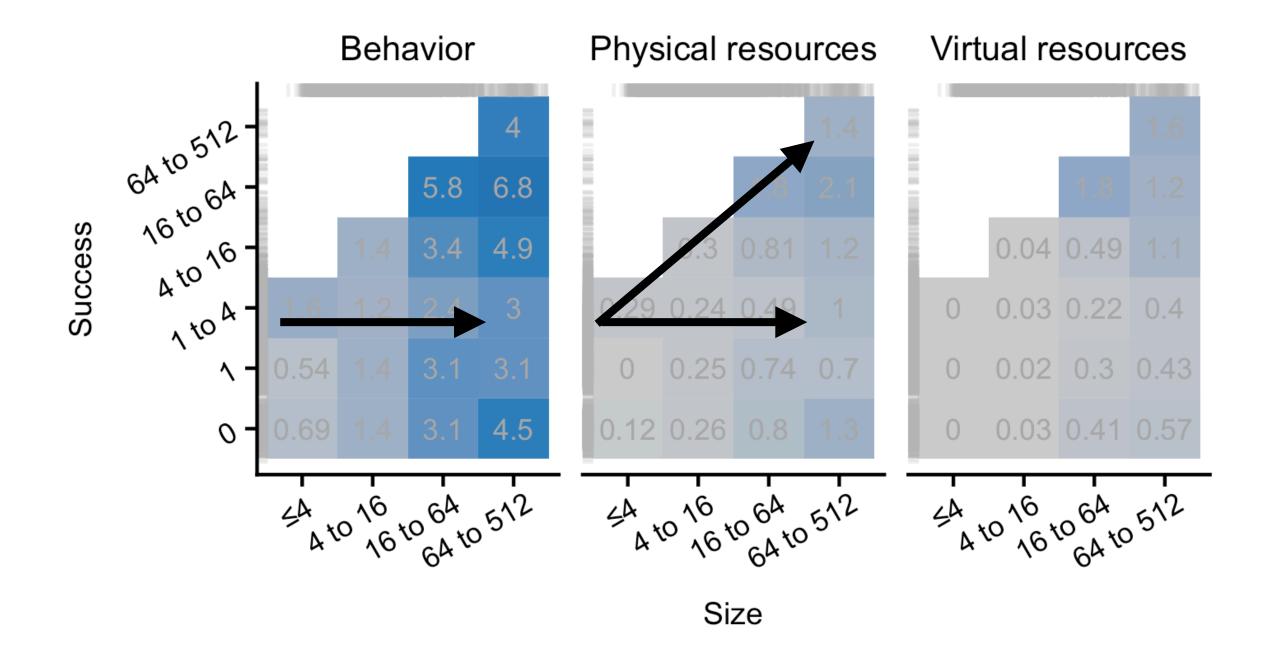
- Scanned the Internet for two years
  - ~hourly
  - found 300,000 servers
    - visited 50,000,000 times
    - by 10,000,000 players

Frey S, Sumner RW (2019)
Emergence of integrated institutions
in a large population of selfgoverning communities. PLoS ONE
14(7): e0216335. http://doi.org/c76k

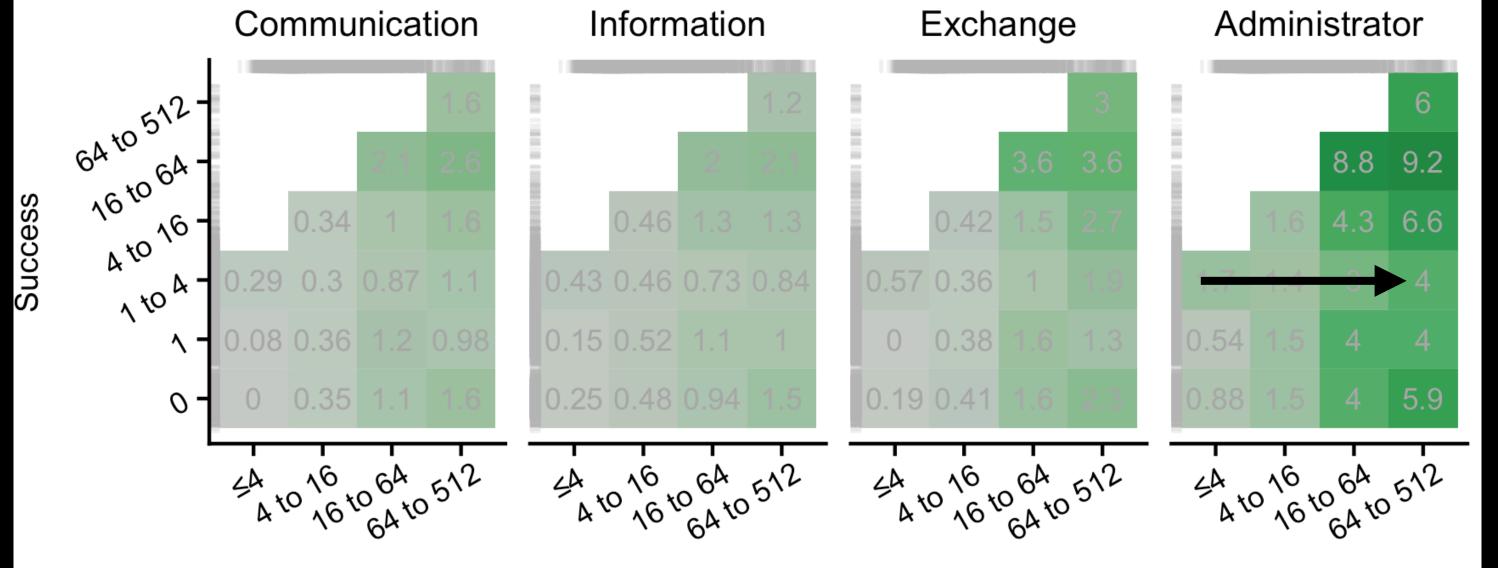
## Most communities are small or unsuccessful



#### Problem type

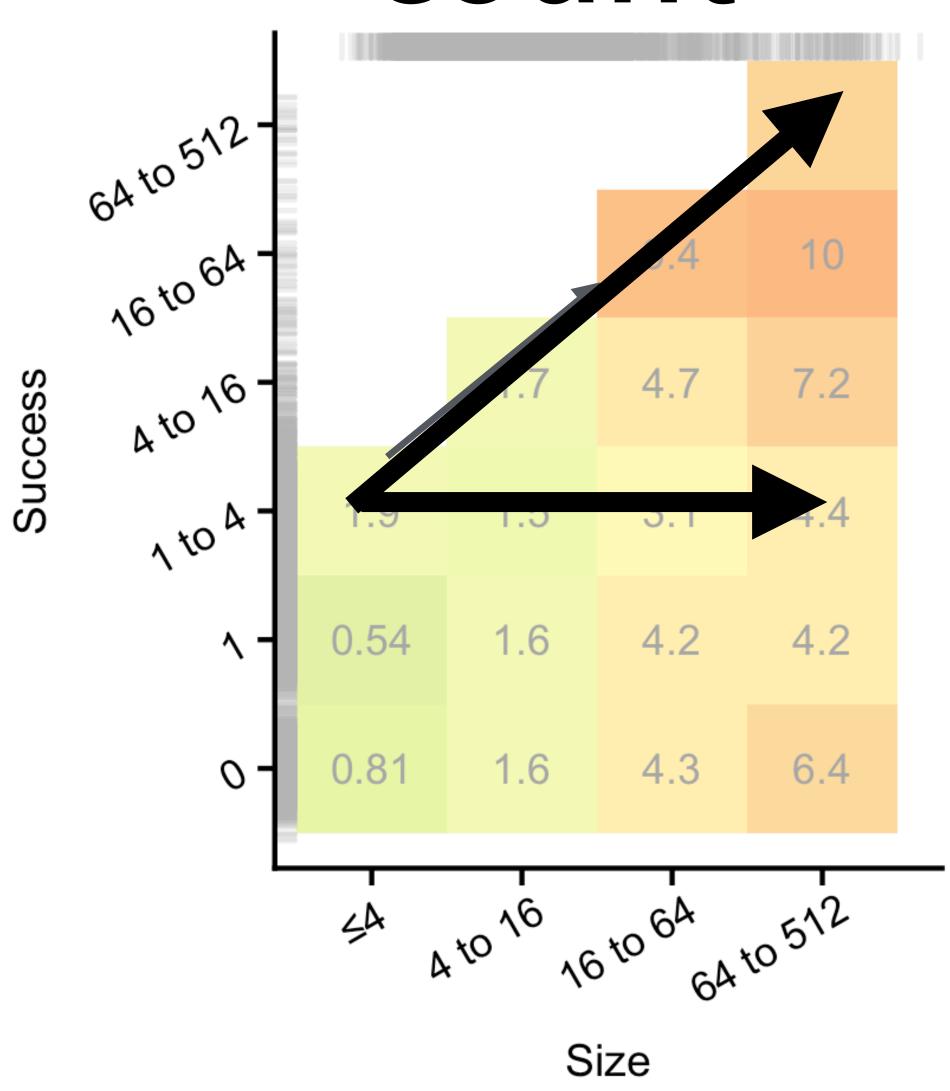




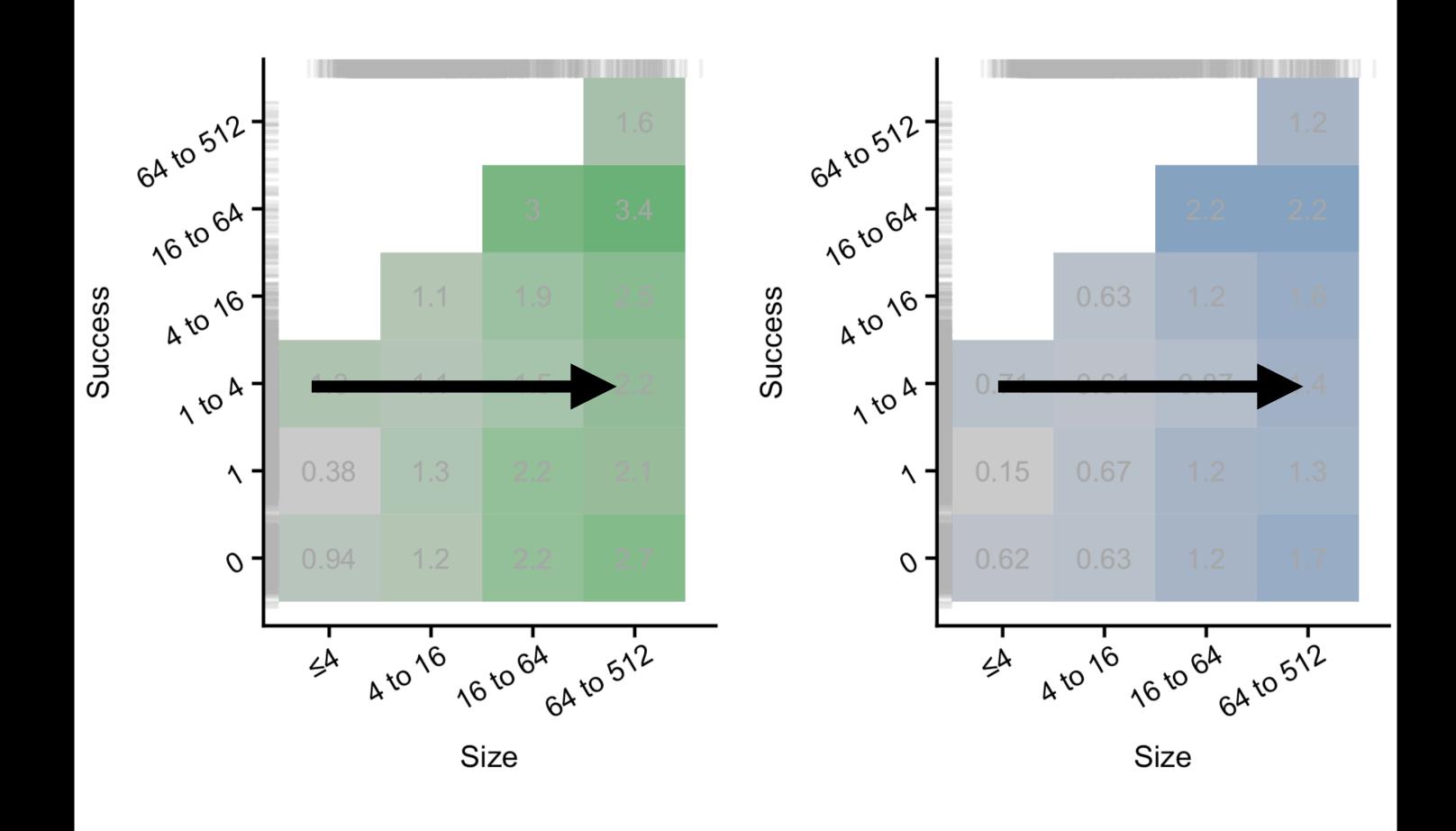


Size

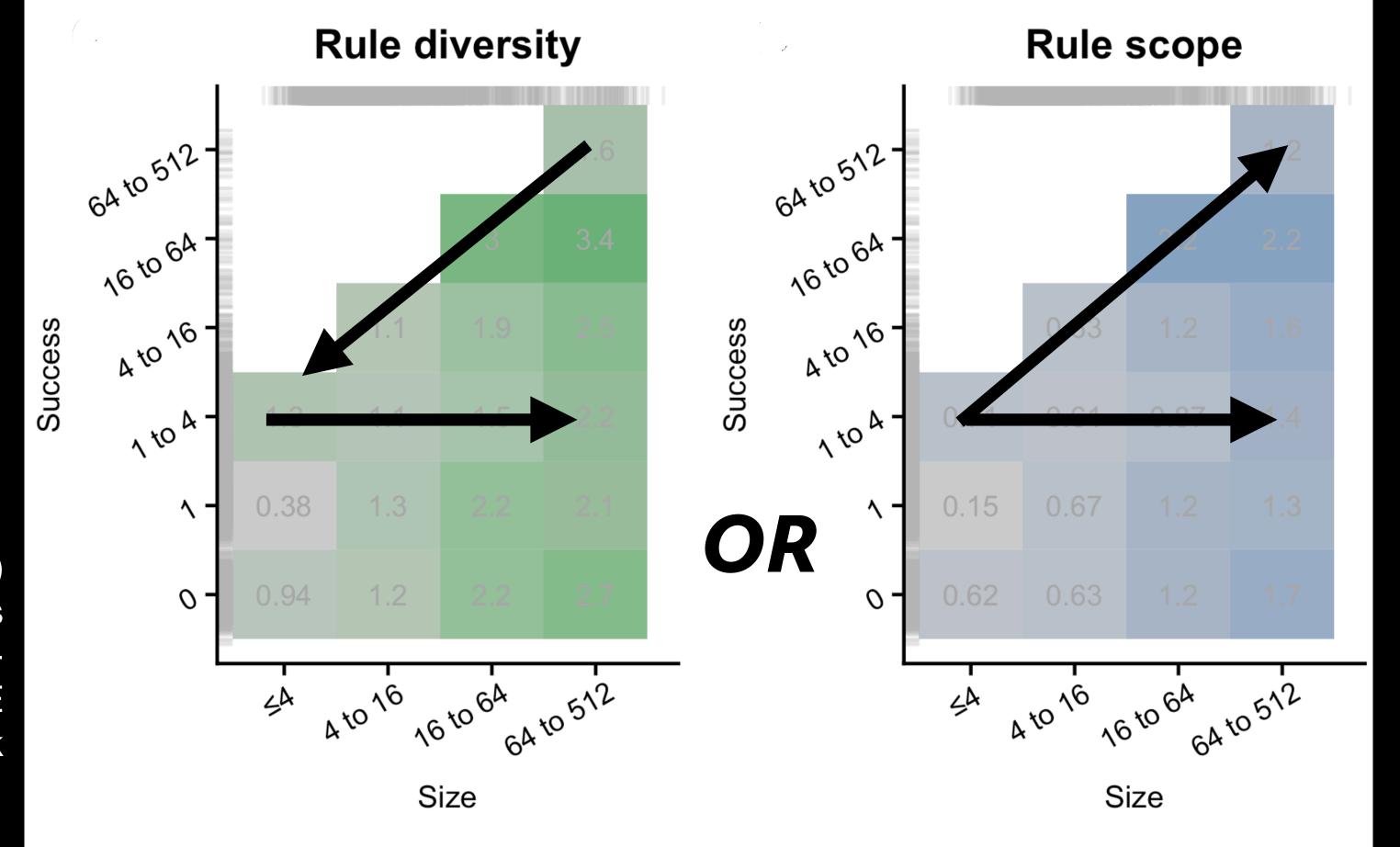
## Rule



## Institutional diversity Variety in problems addressed and ways of addressing them



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Frey S, Sumner RW (2019)
Emergence of integrated institutions in a large population of self-governing communities. PLoS ONE 14(7): e0216335. http://doi.org/c76k

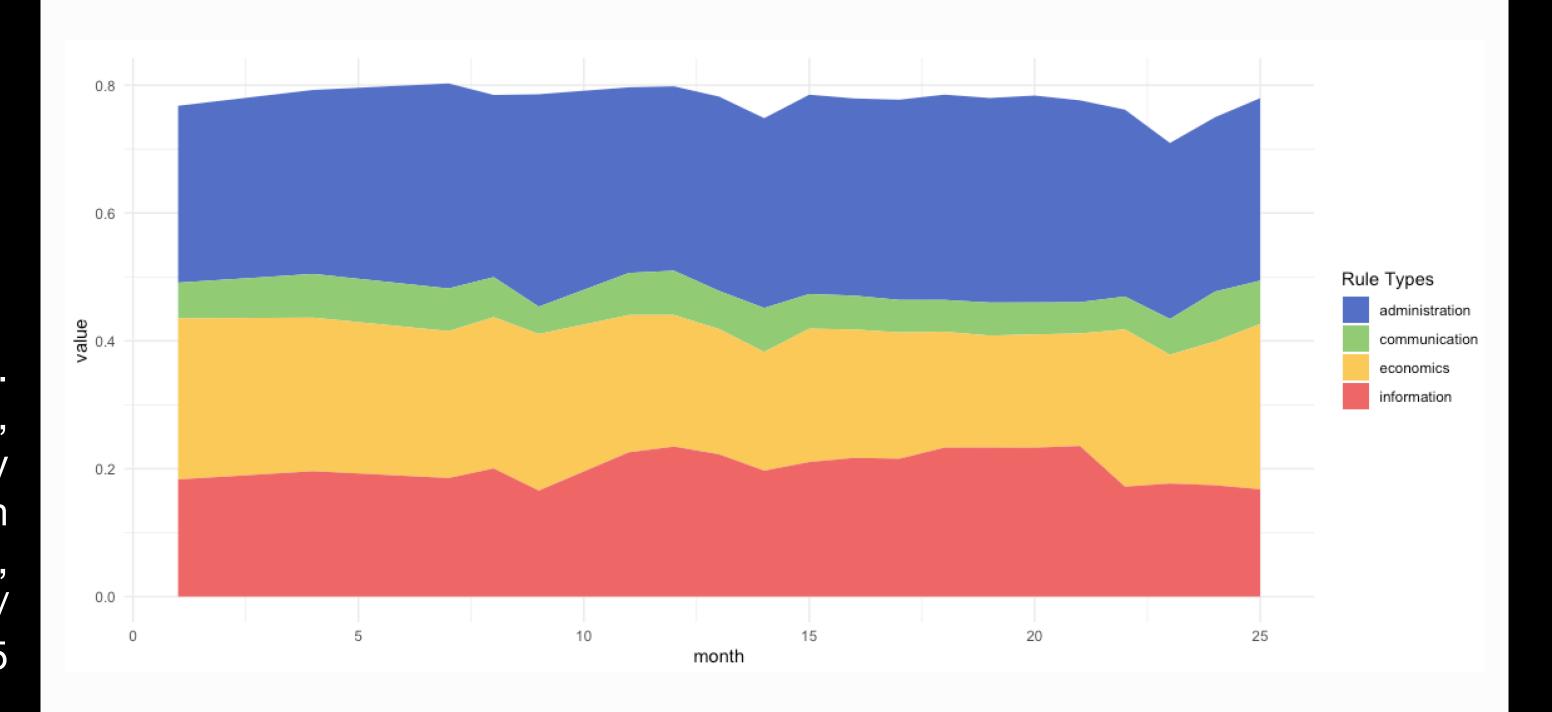
## Communities use rules more to set expectations, less to engineer incentives



Frey, S., Zhong, Q. Q., Bulat, B., Weisman, W. D., Liu, C. M., Fujimoto, S., Wang, H. (2021) Governing online goods: Maturity and formalization in Minecraft, Reddit, and World of Warcraft communities. Proc. ACM Hum.-Comput. Interact. CSCW.

# Selection versus drift in institutional evolution?

Price equation over communities to show strong selection among Minecraft servers



Zhong, Q., Frey, S., & Hilbert, M. (2022). Quantifying the Selective, Stochastic, and Complementary Drivers of Institutional Evolution in Online Communities. Entropy, 24(9), 1185. https://www.mdpi.com/1099-4300/24/9/1185

## Institutional similarity drives cultural similarity

 Communities that govern themselves with similar types of rules are more likely to subsequently attract similar users.

Shared membership network

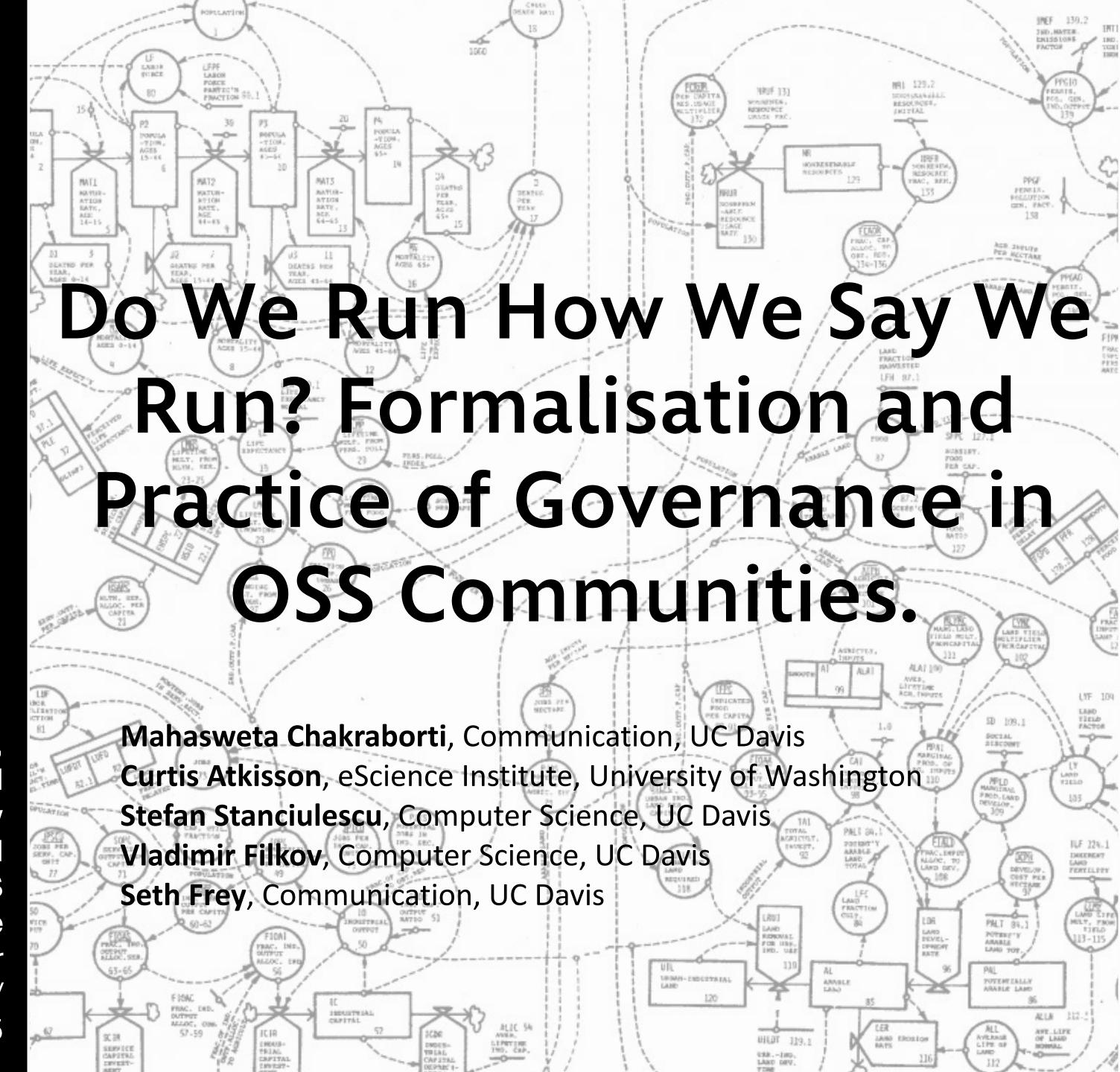
Administrative rule network

Communication rule network

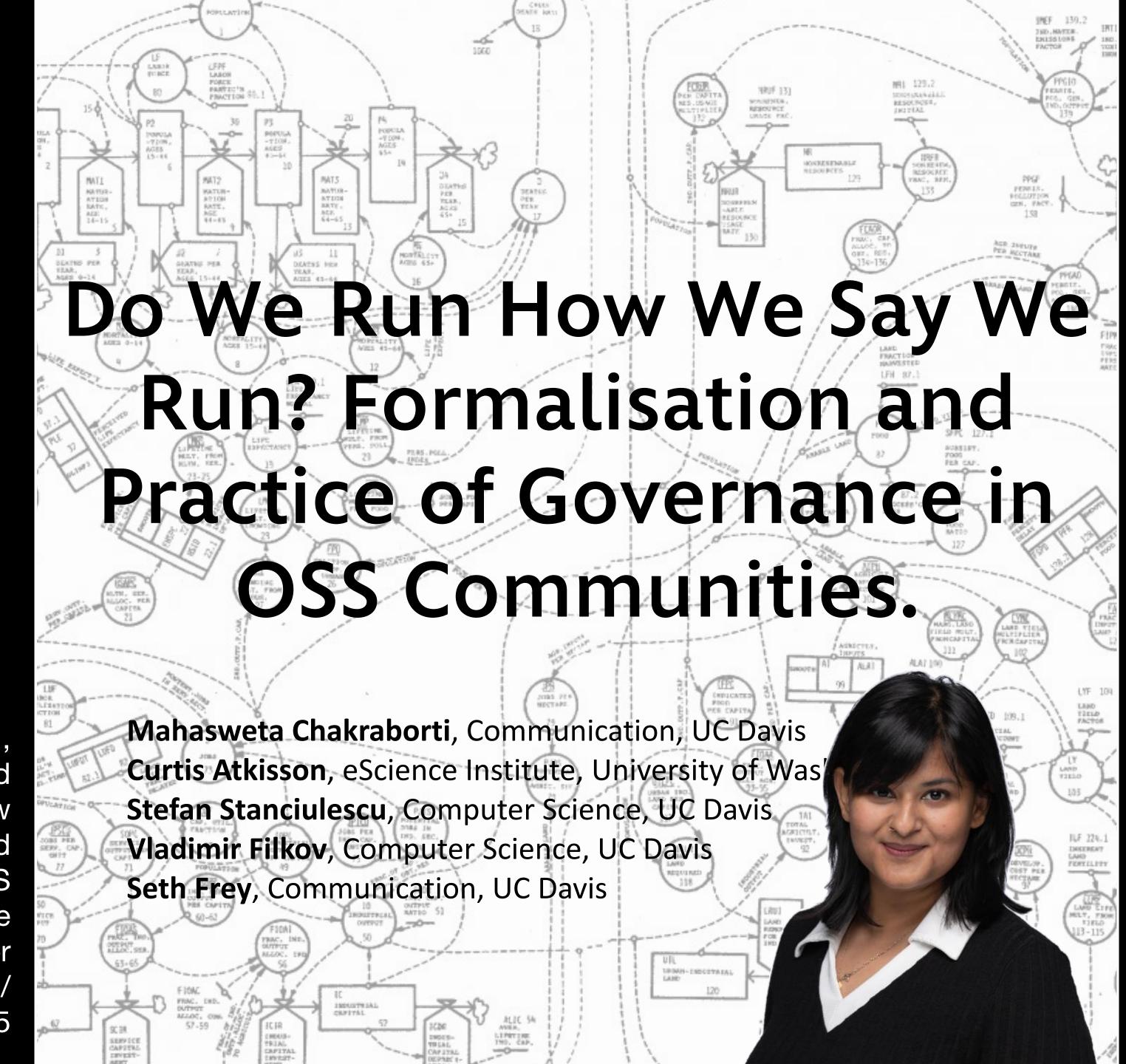
Information rule network

Economy rule network

Zhong, Q., Frey, S. (2022)
Institutional similarity drives cultural similarity among online communities. Nature Scientific Reports 12, 18982. https://doi.org/jq56



Chakraborti, M., Atkisson, C., Stanciulescu, S., Filkov, V., and Frey, S. (in press). Do We Run How We Say We Run? Formalisation and Practice of Governance in OSS Communities. Proceedings of the ACM on Human-Computer Interaction. https://doi.org/10.48550/arXiv.2309.14245



Chakraborti, M., Atkisson, C., Stanciulescu, S., Filkov, V., and Frey, S. (in press). Do We Run How We Say We Run? Formalisation and Practice of Governance in OSS Communities. Proceedings of the ACM on Human-Computer Interaction. https://doi.org/10.48550/arXiv.2309.14245

Open source matters It depends on behavior It has a structure (policy) We have theory about those things But we still don't know if it's good Does behavior in an org reflect structure Is that a good thing?

HTTP Server	Commons	Gump	М	Portals	Т	
Α	Community	Н	MADlib	Pulsar	Tapestry	
Accumulo	Development	Hadoop	Mahout	Q	Tcl	Chakraborti, M., Zhong,
ActiveMQ	Cordova	HAWQ	ManifoldCF	Qpid	Tez	Q., Bulat, B., Frey, S.
Airavata	CouchDB	HBase	Maven	R	Thrift	(2021). Deconstructing
Airflow	Creadur	Helix	Mesos	Ranger	Tika	written rules and hierarchy
Allura	cTAKES	Hive	MetaModel	Ratis	TinkerPop	in peer produced software communities. <a href="https://">https://</a>
Ambari	Curator	HttpComponents	MINA	REEF	Tomcat	arxiv.org/abs/2206.07992
Ant	CXF	Hudi	Mnemonic	River	TomEE	<u>arxiv.org/abs/2200.01352</u>
Any23	D	1	MyFaces	RocketMQ	Traffic Control	Yin, L., Chakraborti, M.,
APISIX	Daffodil	Iceberg	Mynewt	Roller	Traffic Server	Schweik, C., Frey, S.
Archiva	DataFu	Ignite	N	Royale	Trafodion	Filkov, V. (2022), Open
Aries	DataSketches	Impala	NetBeans	Rya	Turbine	Source Software
Arrow		Incubator	NiFi	S	TVM	Sustainability: Combining
AsterixD	pike	IoTDB	Nutch	Samza	U	Institutional Analysis and
Atlas	ory	Isis	0	Santuario	UIMA	Socio-Technical
Attic	hinScheduler	J	OFBiz	Serf	Unomi	Networks, ACM CSCW
Avro		Jackrabbit	Olingo	ServiceComb	Usergrid	https://arxiv.org/abs/
Axis	uid	J mes	06 21	Se rice ix	V	<u>2203.03144</u>
	ubbo	j ouds // /	Cazie	Shardir Sphere	VCL	
Bahir //	E		CenJPA	Sn o	Velocity	Chakraborti, M., Atkisson,
Beam //	ECharts	J leter	O <sub>i</sub> enMeetings	SII GA	W	C., Stanciulescu, S., Filkov, V., and Frey, S. (in
Bigtop	Empire-	l Innzon	Open.	SIS	Web Services	press). Do We Run How
Bloodhc	E	Joshua	OpenOffice	SkyWalkina	Whimsy	We Say We Run?
BookKe	Felix SOF	JSVWikA R L	pe VerBeans	Aind 10 N	Wicket	Formalisation and
Brooklyr /	Fineract	juddi	OpenWhisk	Solr	×	Practice of Governance in
Buildr	Flex -	<del>-Jun</del> e@STABLI	SHED 1999	SparriAssassim	Xalan	OSS Communities.
BVal	Flink	K	Ozone	Spark	Xerces	Proceedings of the ACM
С	Flume	Kafka	Р	Sqoop	XML Graphics	on Human-Computer
Calcite	Fluo	Karaf	Parquet	Steve	Y	Interaction. https://
Camel	FreeMarker	Kibble	PDFBox	Storm	Yetus	doi.org/10.48550/
CarbonData	G	Knox	Perl	Streams	Z	arXiv.2309.14245
Cassandra	Geode	Kudu	Petri	Struts	Zeppelin	
Cayenne	Geronimo	Kylin	Phoenix	Submarine	ZooKeeper	
Celix	Giraph	L	Pig	Subversion		
Chemistry	Gobblin	Libcloud	Pivot	Superset		

THE APACHE WAY TO ME..."

"open, respect and collaborate"

—Shaofeng Shi, 15 year user of Apache Tomcat, Kylin, Hadoop, Spark, Kafka, MyBatis, HBase, Flink, contributor to Apache Kylin, Superset, Spark

#### WHAT MAKES THE APACHE WAY SO HARD TO DEFINE?

The Apache Way is a living, breathing interpretation of one's experience with our community-led development process. Apache projects and their communities are unique, diverse, and focused on the activities needed at a particular stage of the project's lifetime, including nurturing communities, developing great code, and building awareness. What is important is that they embrace:

- *Earned Authority:* all individuals are given the opportunity to participate, but their influence is based on publicly earned merit what they contribute to the community. Merit lies with the individual, does not expire, is not influenced by employment status or employer, and is non-transferable (merit earned in one project cannot be applied to another). More on merit.
- *Community of Peers:* individuals participate at the ASF, not organizations. The ASF's flat structure dictates that roles are equal irrespective of title, votes hold equal weight, and contributions are made on a volunteer basis (even if paid to work on Apache code). The Apache community is expected to treat each other with respect in adherence to our <u>Code of Conduct</u>. Domain expertise is appreciated; Benevolent Dictators For Life are disallowed. <u>More on individual participation</u>.
- *Open Communications:* as a virtual organization, the ASF requires all communications related to code and decision-making to be publicly accessible to ensure asynchronous collaboration, as necessitated by a globally-distributed community. Project mailing lists are archived, publicly accessible, and include:
  - dev@ (primary project development)
  - user@ (user community discussion and peer support)
  - o commits@ (automated source change notifications)
  - occasionally supporting roles such as marketing@ (project visibility)

...as well as restricted, day-to-day operational lists for Project Management Committees. Private decisions on code, policies, or project direction are disallowed; off-list discourse and transactions must be brought on-list. More on <u>communications</u> and the <u>use of mailing lists</u>.

- *Consensus Decision Making:* Apache Projects are overseen by a self-selected team of active volunteers who are contributing to their respective projects. Projects are auto-governing with a heavy slant towards driving consensus to maintain momentum and productivity. Whilst total consensus is not possible to establish at all times, holding a vote or other coordination may be required to help remove any blocks with binding decisions, such as when declaring a release. More on decision making and voting.
- Responsible Oversight: The ASF governance model is based on trust and delegated oversight. Rather than detailed rules and hierarchical structures. ASE governance is principles-based with self-governing projects providing reports directly to the Board. Apache Committees

# Apache Software Foundation Incubator (ASFI)

- —Founded by Apache Software Foundation in 2002
- -Mentored over 300 projects
- Projects are autonomous in development and community specifics
- Incubator regulates administration, licensing, infrastructure, branding and production standards

# Apache Software Foundation Incubator (ASFI)

- —Founded by Apache Software Foundation in 2002
- —Mentored over 300 projects
- Projects are autonomous in development and community specifics
- Incubator regulates administration, licensing, infrastructure, branding and production standards

different asf projects have different policies. the important part is that we should have a common understanding about our commit policy. there might e.g. be a branch for the next release where rtc (review then commit) is applied. that's useful when preparing a release or for maintenance releases we still actively maintain. and beside that we might have a 'future' branch (e.g. on master) or multiple feature branches where ctr (commit then review) is standard. most asf projects have the whole repo on ctr...

### Research Question

—How do foundation policies relate to project operations and performance?



### Research Question

- —How do foundation policies relate to project operations and performance?
  - —What is the relationship of *rules-in-form* and *rules-in-use*?
- —Does formalization relate to extent of structured operations?
- —How much do members internalize formal regulation?
- —Do governed activities and policy internalization relate to project outcome?

#### Data

- —ASF incubator policies (Sen et al, 2022).
  - —About 250 sentences
- —Developer emails of 208 projects scraped from public ASFI mailing list archives (Yin et al, 2021)
  - —About 2M sentences from 700,000 emails
- Project covariates: development scale and membership (Stănciulescu et al, 2022)
  - —Active committers
    - —Number of commits
    - —Lines of code contributed
  - —Total time in incubation

### Governance practice

different asf projects have different policies. the important part is that we should have a common understanding about our commit policy. there might e.g. be a branch for the next release where rtc (review then commit) is applied. that's useful when preparing a release or for maintenance releases we still actively maintain. and beside that we might have a 'future' branch (e.g. on master) or multiple feature branches where ctr (commit then review) is standard. most asf projects have the whole repo on ctr...

### Governance practice

#### **Original Policy:**

'After a vote has finished, the ipmc must send a notice email to the board and then wait for 72 hours before inviting the proposed member'

#### **Semantic Role Parsing:**

'ARG0': ['the ipmc'], 'ARGM-MOD': ['must'], 'V': ['send'], 'ARG1': ['a notice'], 'ARGM-DIR': ['email'],

'ARG2': ['to the board'], 'ARGM-TMP': ['after a vote has finished']

'ARG1': ['the ipmc'], 'ARGM-MOD': ['must'], 'V': ['wait'], 'ARGM-TMP': ['after a vote has finished', 'then',

for 72 hours', 'before inviting the proposed member']

#### **Performance Programs (After reconstitution):**

'After a vote has finished the ipmc must send a notice email to the board'

'After a vote has finished the ipmc must then wait for 72 hours before inviting the proposed member'

Table 1: Activities from compound sentences through Semantic Role Labeling (SRL). ARG0 denotes agent, ARG1-ARG5 are direct/indirect objects, ARG-MOD indicate modals while ARG-TMP and ARG-DIR are the temporal and directional arguments respectively

#### **Original Sentence:**

'(1) I'll be away from my computer starting Friday and through the New Year, so I won't be able to do much to help if folks want to release 2.1 during that time (not even testing).' (Apache Roller, 12/21/2005)

#### After SRL and reconstitution:

'I'll be away from my computer starting Friday and through the New Year' (Schedules/Events)

I won't be able to do much to help if folks want to release 2.1 during that time ( not even testing )' (Release Management)

Table 2: Capturing granularity: Sentences spanning multiple, thematically distinct operations. In this example, a developer shares their vacation timeline to the community in general, while also discussing implications for a tentative release. Topics indicated for each activity are inferred as described in Section 5.3.3

### Institutional grammar

Policy	Attribute	Object	Deontic	Aim
Each podling in incubation must report to the incubator pmc.	each podling in incubation	pmc	must	report
A mentor must be an ipmc member	a mentor	an ipmc member	must	be
IPMC members are free to volunteer to mentor a podling . to do so , they should mail the podling stating their intentions	ipmc members are free	a podling to do, the podling stating their	should	to volunteer to mentor, mail
It 's also good to encourage developers by suggesting new related work they may like to volunteer to work on	DOG 8 DUC	developers, new related work, like to volunteer to	may	good to encourage, suggesting

Chakraborti, M., Zhong, Q., Bulat, B., Frey, S. (2021). Deconstructing written rules and hierarchy in peer produced software communities. https://arxiv.org/abs/2206.07992

### Pipeline

come to

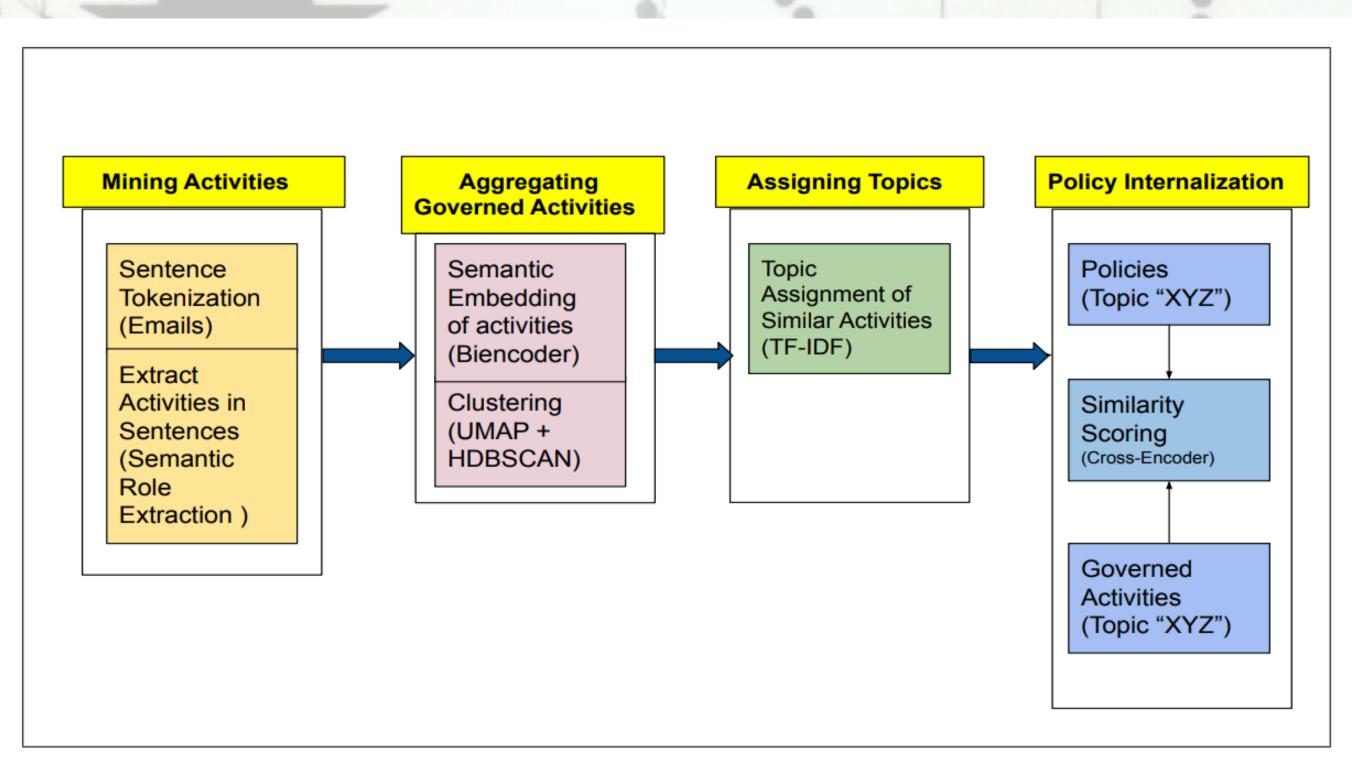
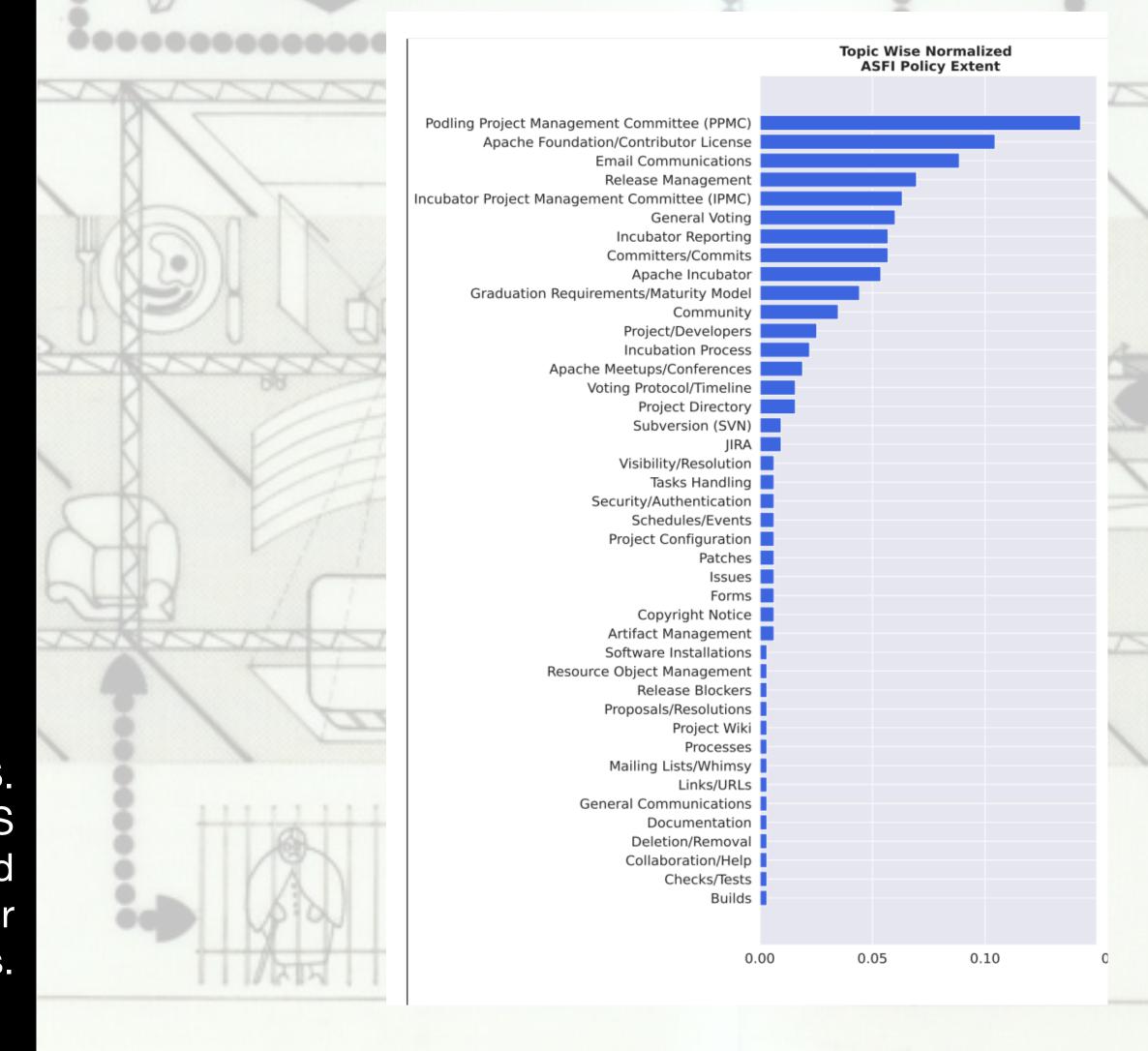


Figure 1: Language modeling pipeline for extracting activities, aggregating routine governed behavior, and evaluating internalization.

111111111

What are the governed topics?



# Are more heavily governed topics discussed more or less?

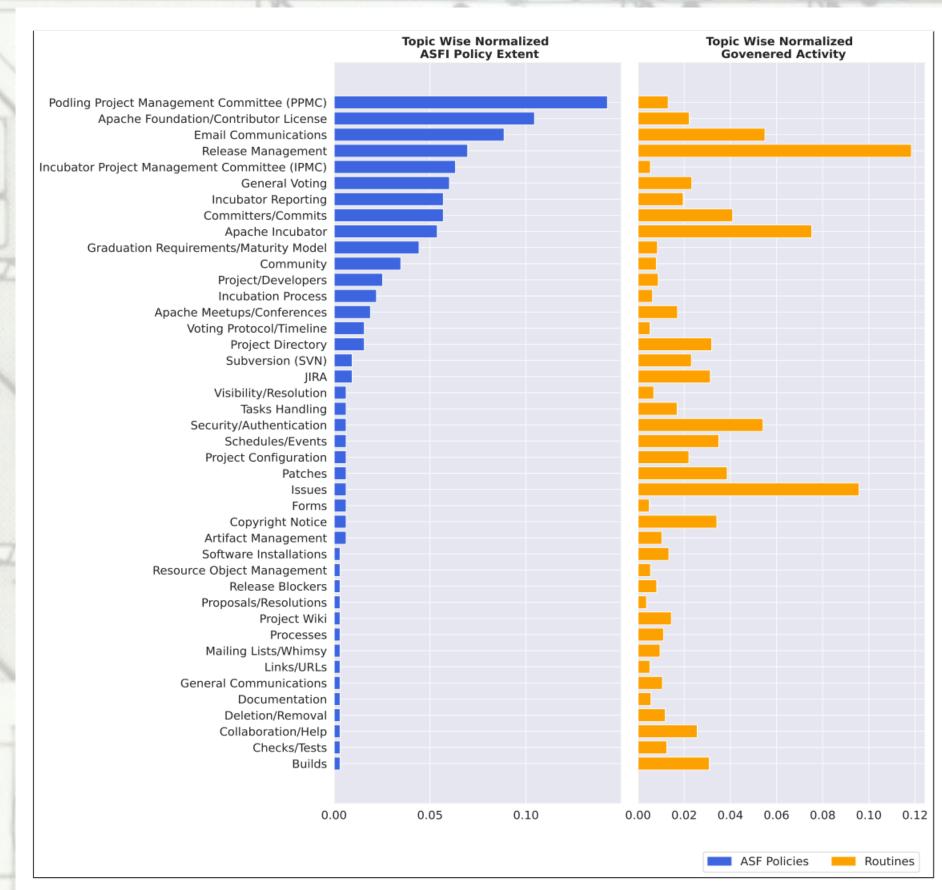


Figure 2: Left: Distribution of ASFI policy extent across governance topics. Right: Distribution of governed activity of projects across different governance topics. Governed activity was not found to be significantly correlated to policy extent.

## Is more policy associated with more internalization?

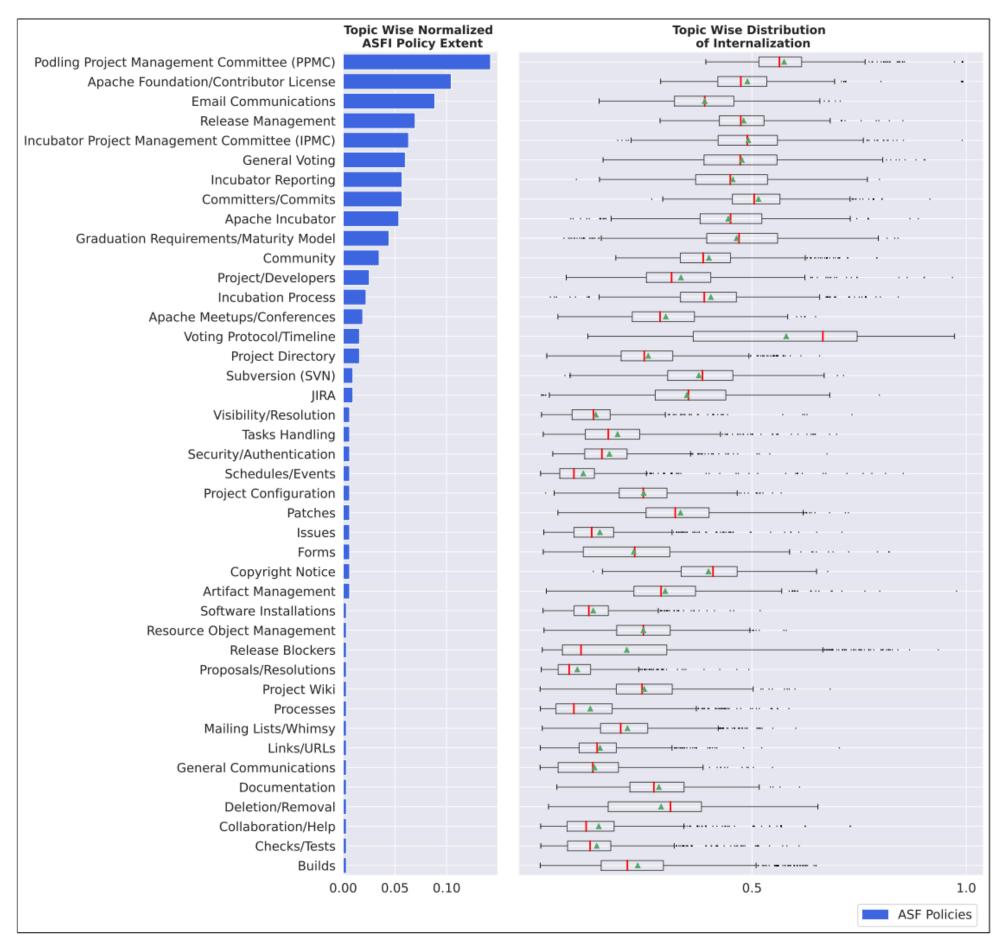


Figure 3: Left: Distribution of ASFI policy extent across governance topics. Right: Distribution of internalization scores within topics. Red and Green markers indicate the median and mean respectively. Internalization is observed to be higher in governance topics which are more regulated.

# Does practice or internalization influence outcomes?

Table 3: Summary RQ3: Binomial(Logit) GLM regression of project governance against Graduation/Retirement

	Covariates		Covariates and Governed Activity		Covariates and Internalization		All	
Predictor	Coefficient	p	Coefficient	p	Coefficient	p	Coefficient	p
Intercept	2.490	0.000	3.032	0.000	3.252	0.000	4.427	0.000
Committers <sup>2</sup>	0.077	0.874	-0.018	0.973	-0.3074	0.637	0.127	0.875
Commits <sup>2</sup>	0.705	0.140	0.615	0.243	0.772	0.195	0.197	0.793
Developer Emails <sup>2</sup>	0.807	0.016	1.069	0.020	1.000	0.020	1.188	0.079
Incubation time <sup>1</sup>	-0.518	0.011	-0.181	0.555	-0.799	0.004	-0.334	0.420
Incubator Reporting <sup>2</sup>			-1.210	0.011			-1.827	0.002
Patches <sup>2</sup>			0.688	0.011			1.009	0.009
Project Configuration <sup>1</sup>					0.765	0.002	0.623	0.043
Task Handling <sup>1</sup>					-0.511	0.054	-0.609	0.084
Project Wiki <sup>1</sup>					-0.720	0.032	-1.417	0.005
Voting Protocol/Timeline <sup>1</sup>					0.428	0.129	0.933	0.013
Graduation Requirements/Maturity Mode <sup>1</sup>					0.898	0.001	1.058	0.002
Observations: 208	R <sup>2</sup> (Tjur):	0.258	R <sup>2</sup> (Tjur):	0.360	R <sup>2</sup> (Tjur):	0.486	R <sup>2</sup> (Tjur):	0.648
	AIC:	139.91	AIC:	124.96	AIC:	113.34	AIC:	90.29

### Conclusion

- —Communities do not run how they say they run
- —More policy making frame operations, but does not follow how extensively communities govern themselves.
- —Successful projects tend to govern themselves along less formalized domains
- —Should we run how we say we run?

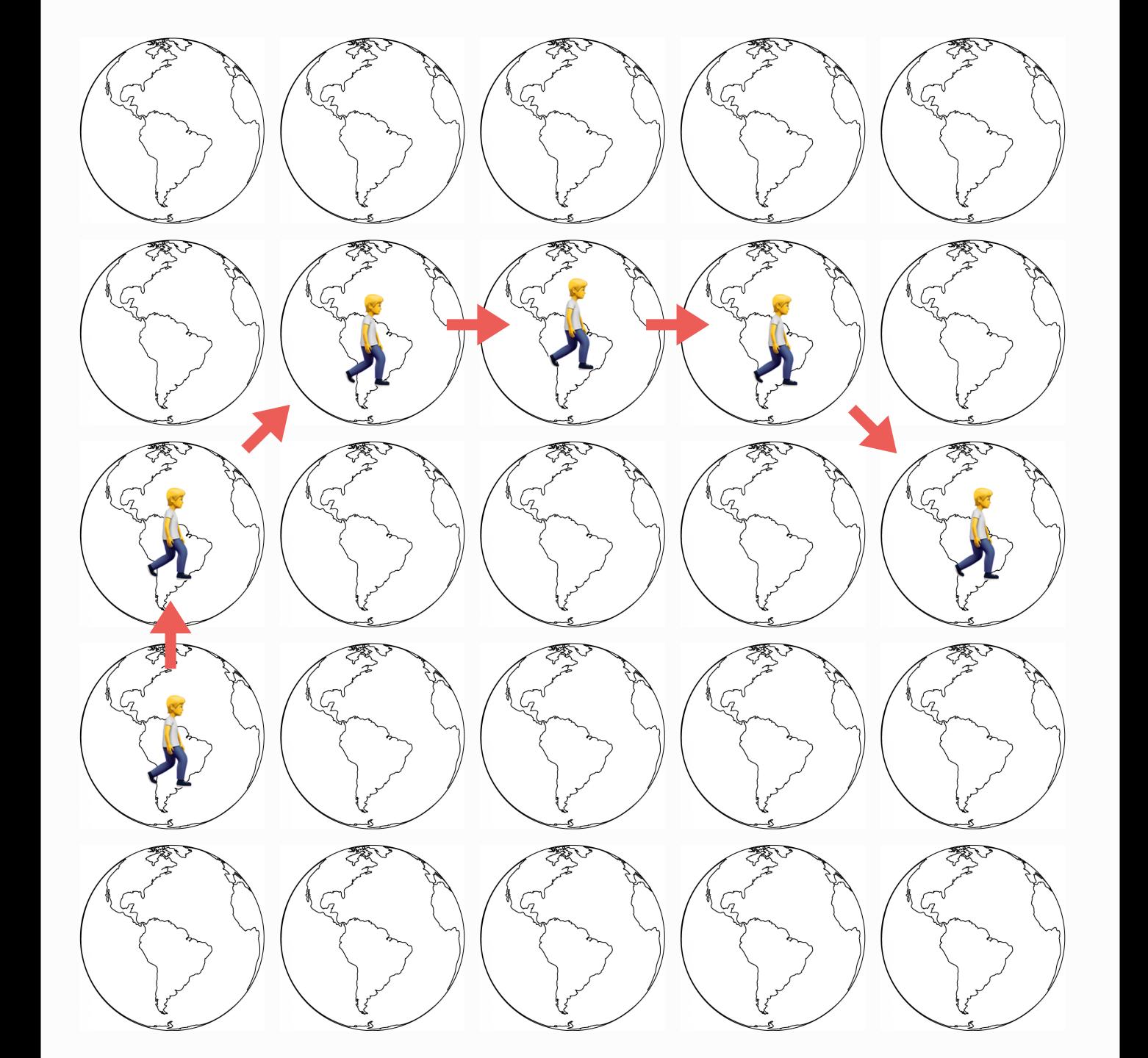
# Dynamics over games and institutional preferences

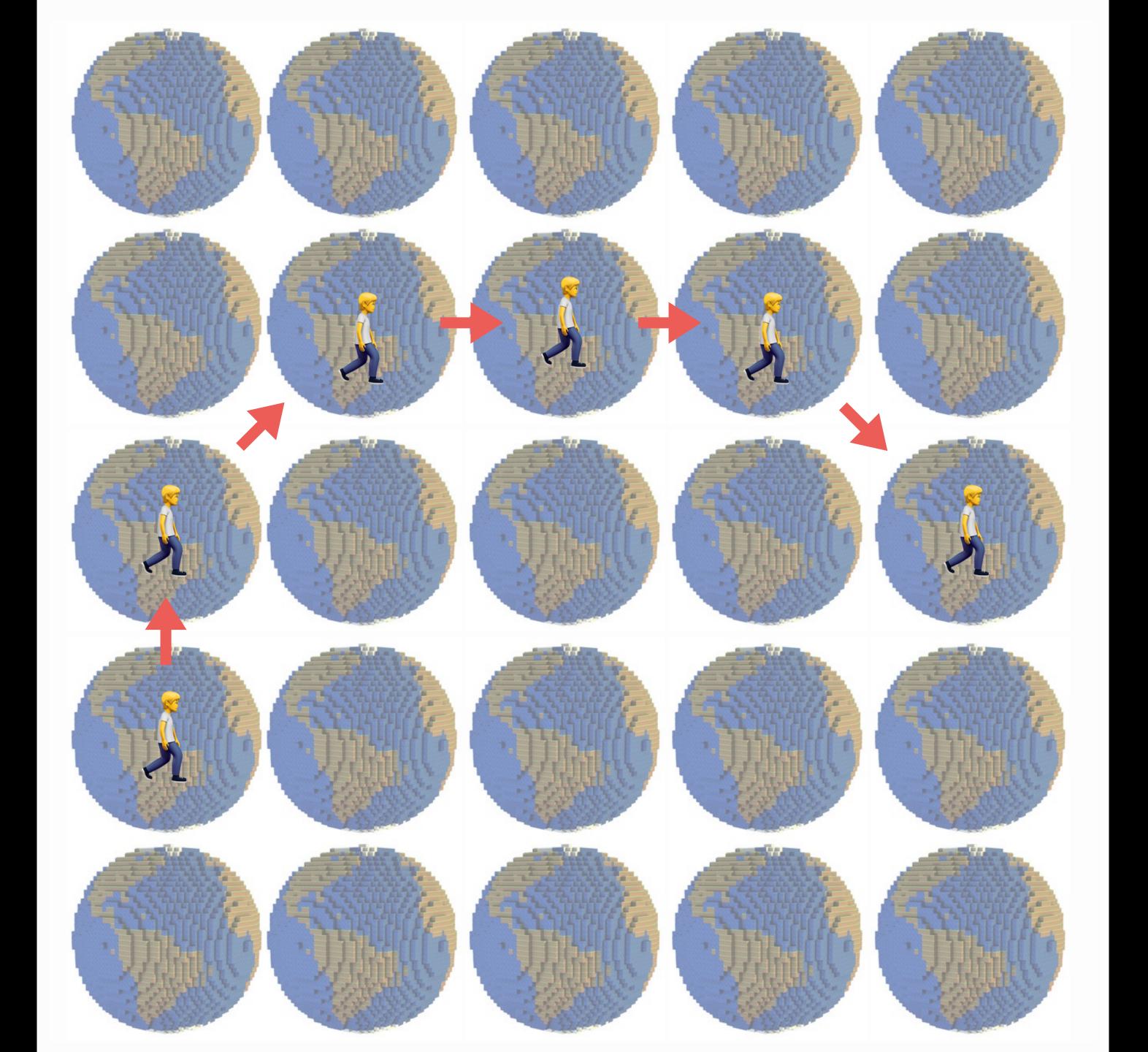
**Seth Frey** 

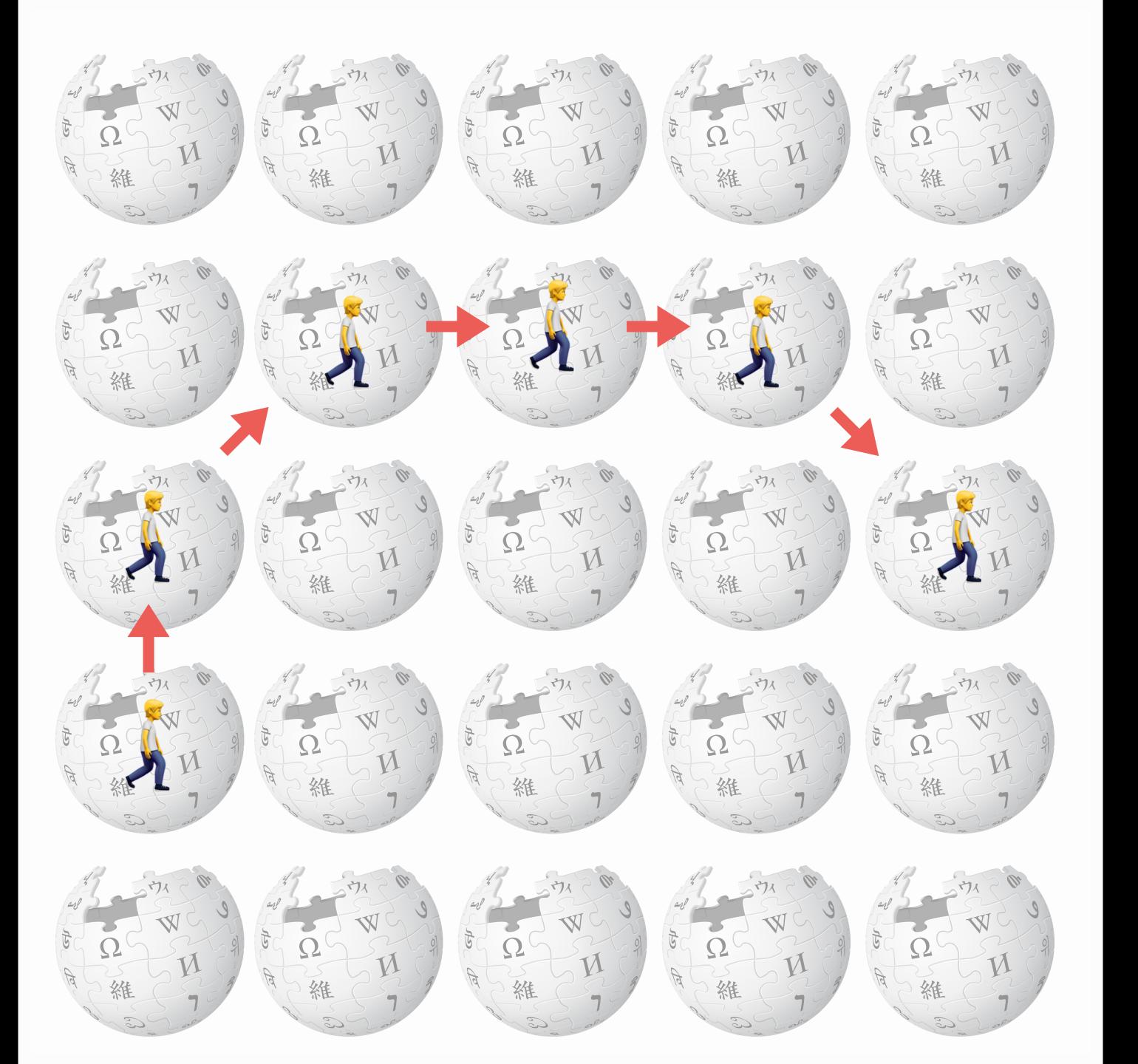
Communication, University of California, Davis

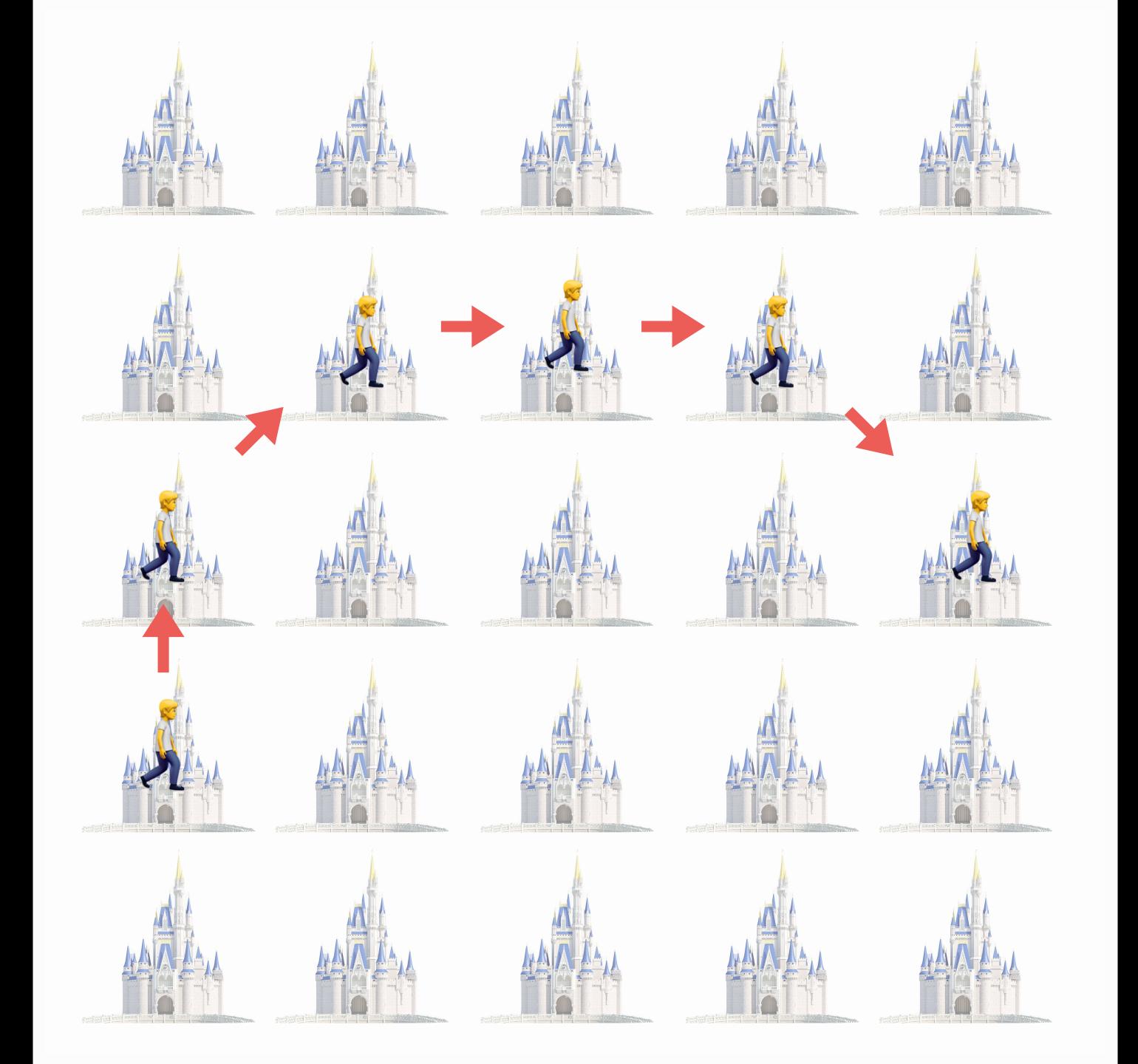
Frey, S. and Atkisson C. (2020) A dynamic over games drives selfish agents to win–win outcomes Proc. R. Soc. B.28720202630. <a href="https://doi.org/fnq2">https://doi.org/fnq2</a>









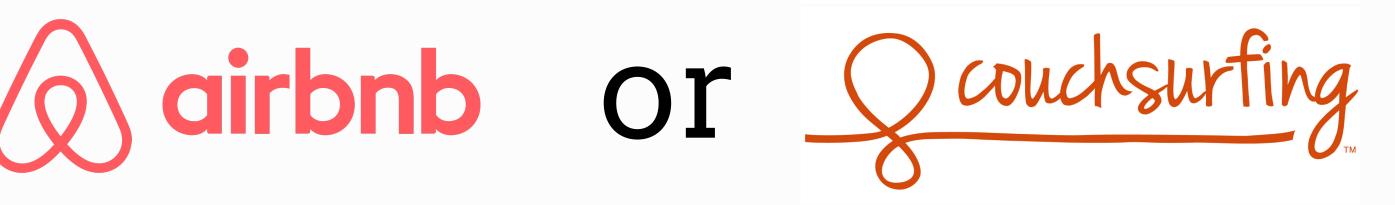


Tip 15%

Or

Tip 20%







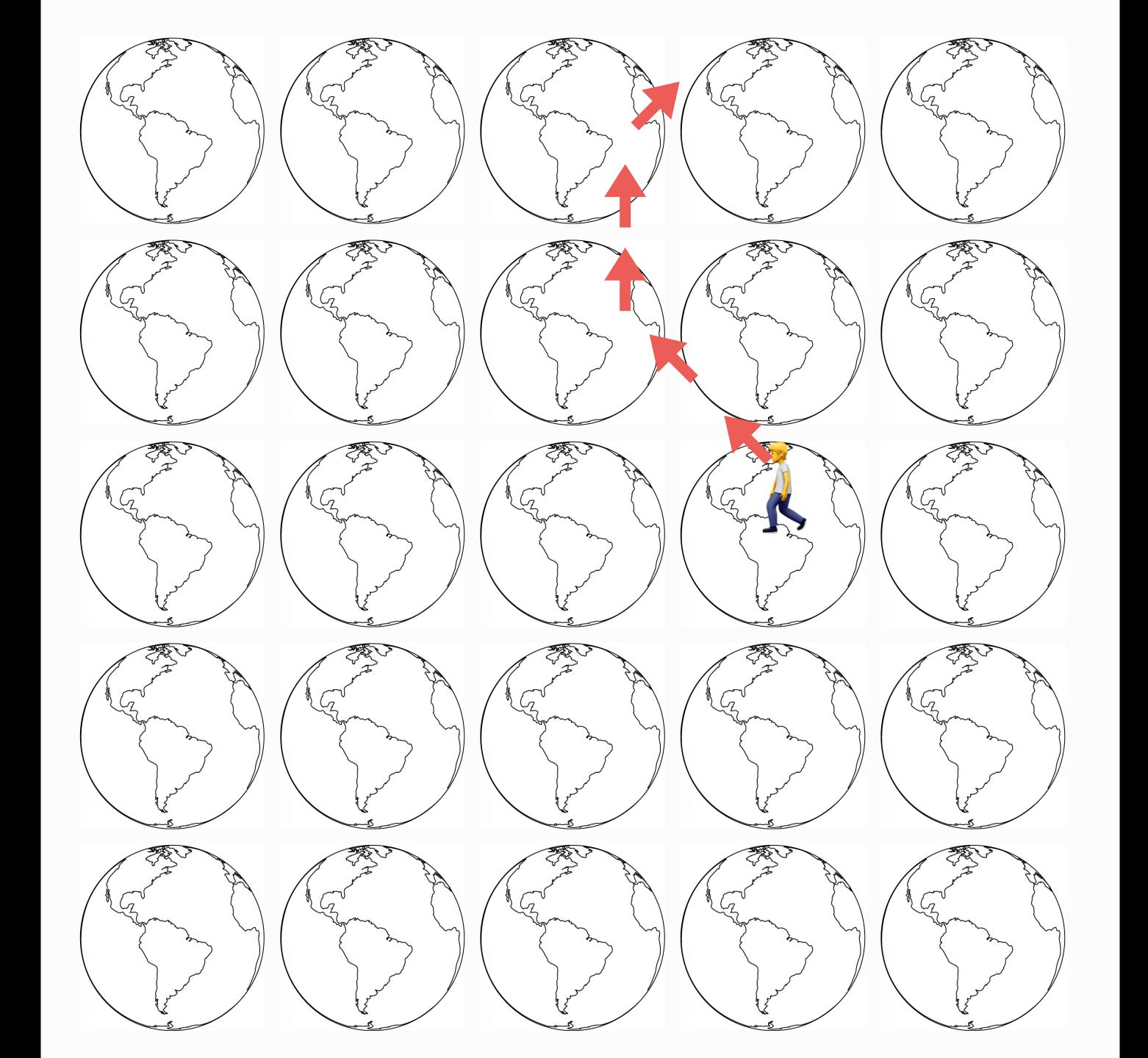


### And in philosophy...

Philolaus' Antichthon
Rawls' veil of ignorance
Tiebout competition
Hirschman's exit and voice
Nozick's utopia

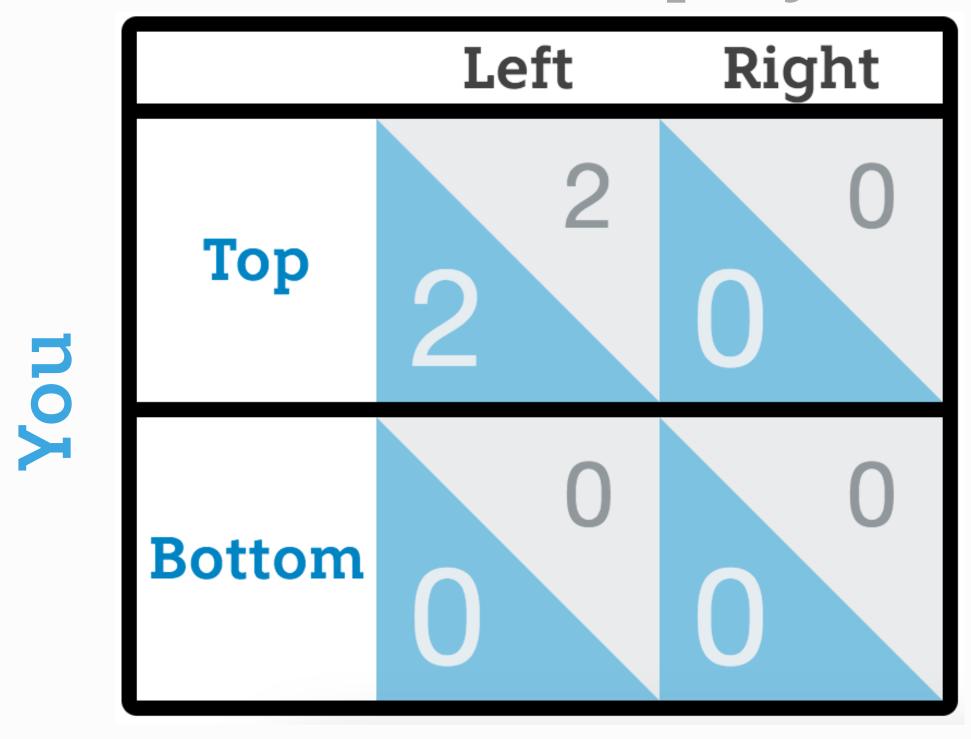
Institutional change is a dynamic *over* a space of systems.

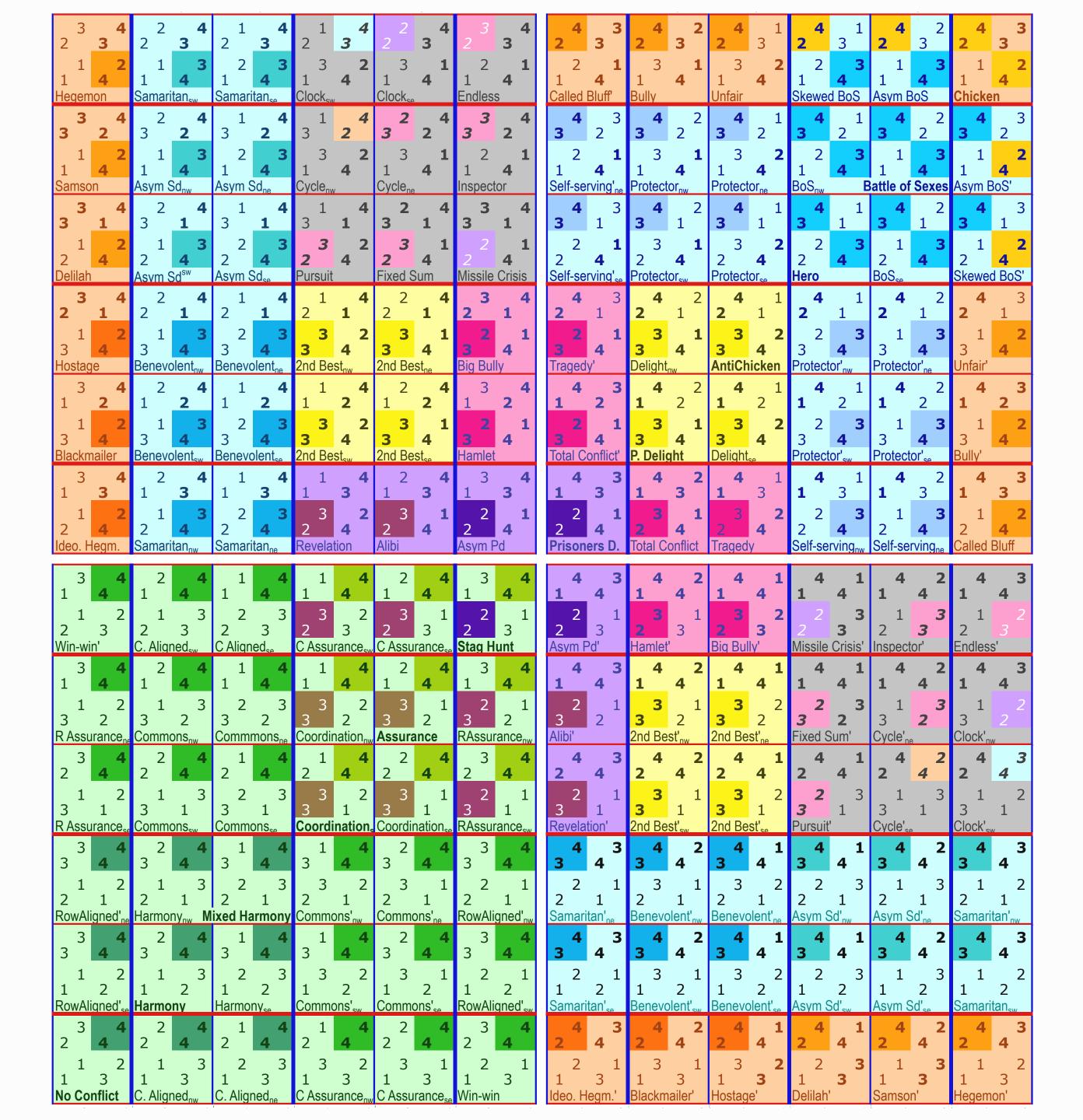
This is a powerful *general* framework for the empirical study of cultural evolution.

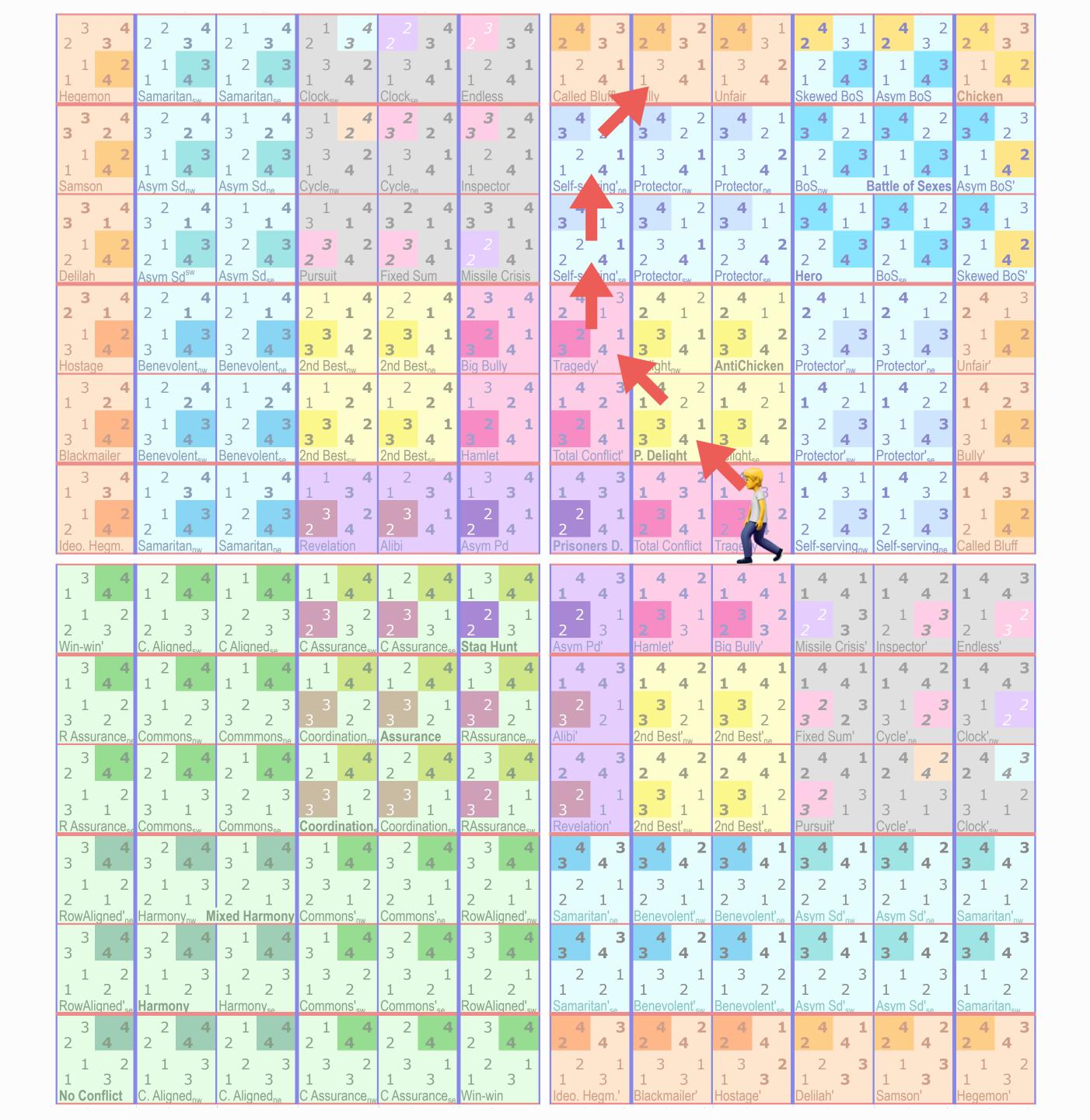


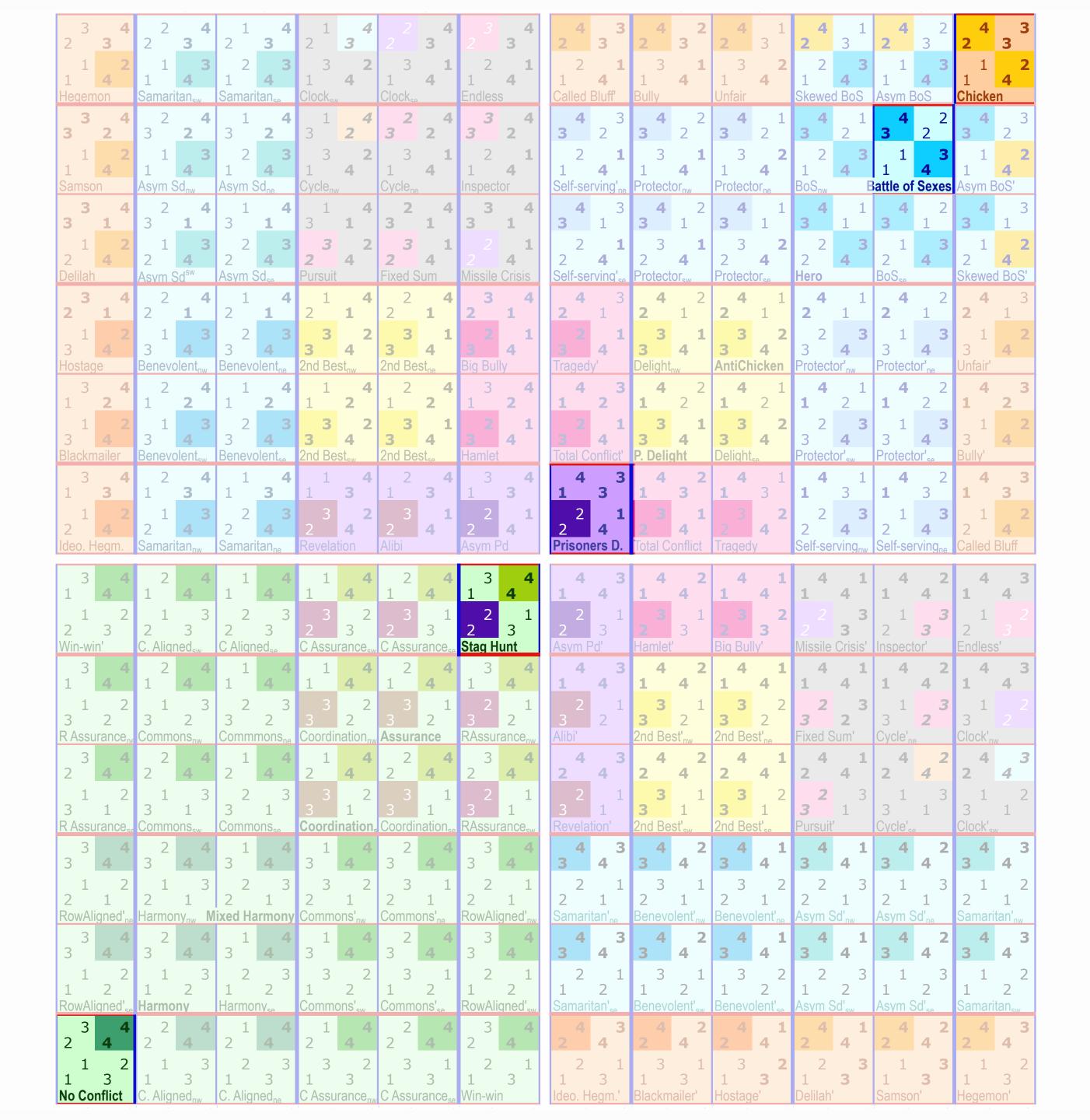
### Economic games are minimal institutions

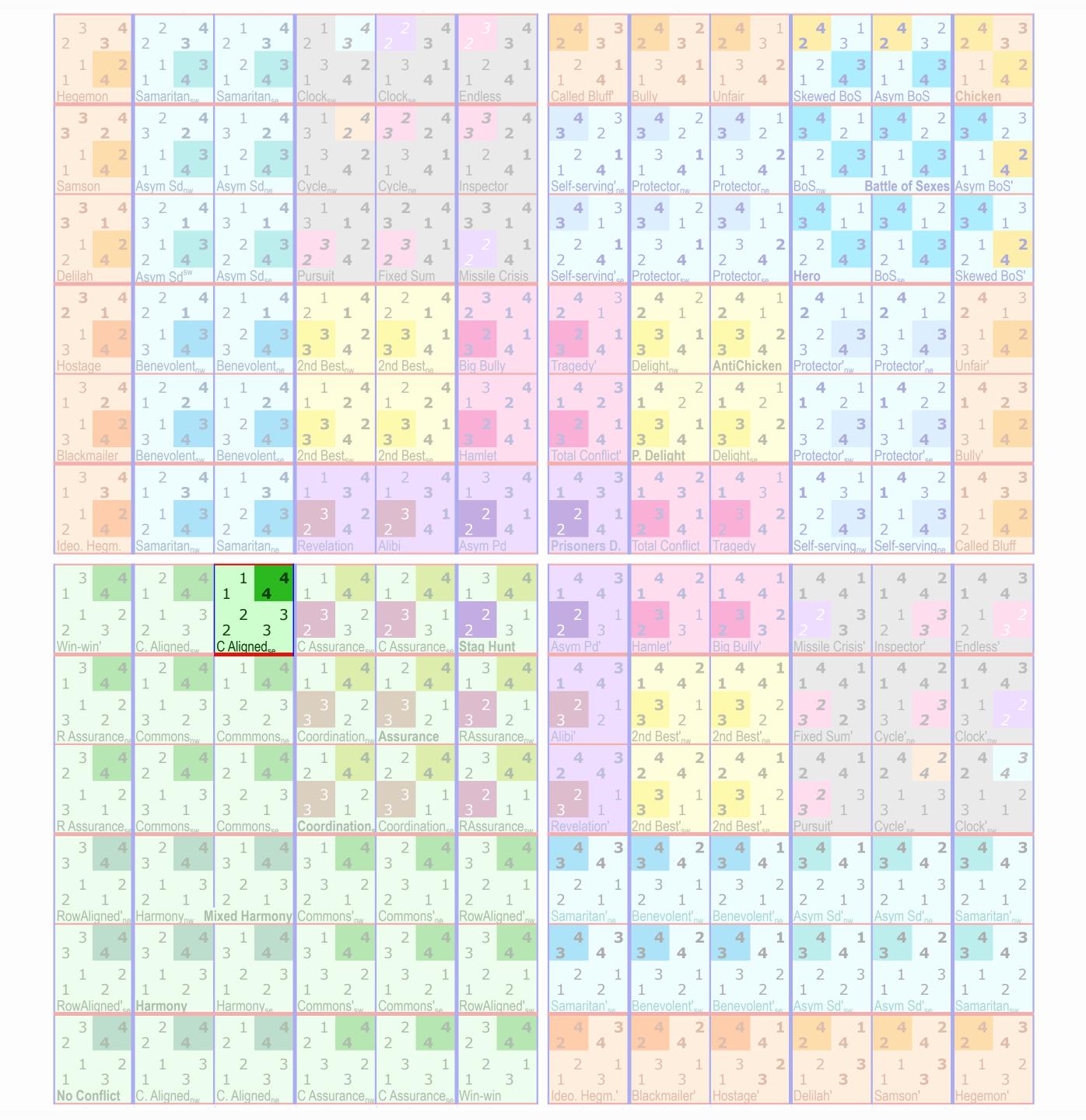
Other player

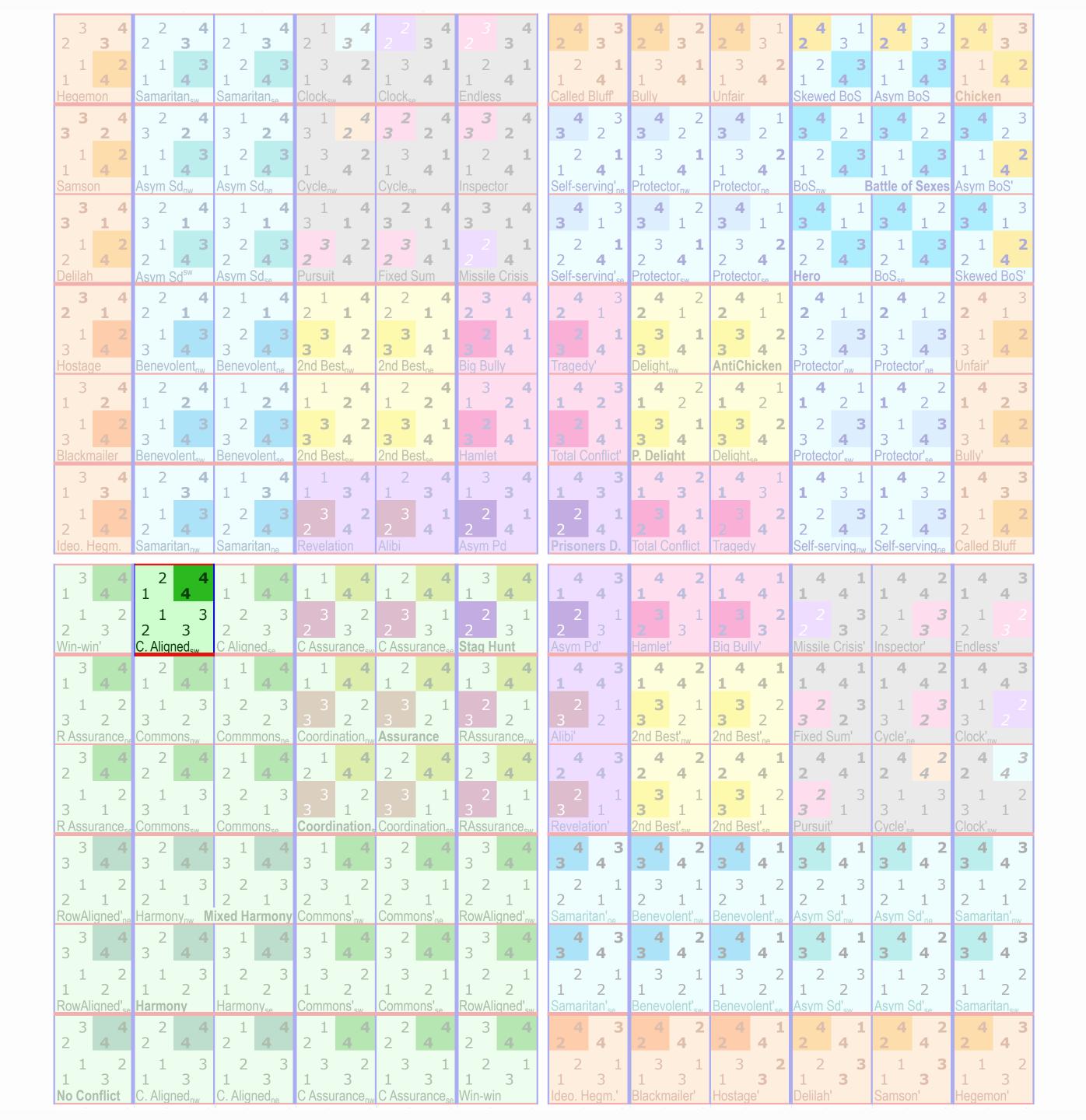


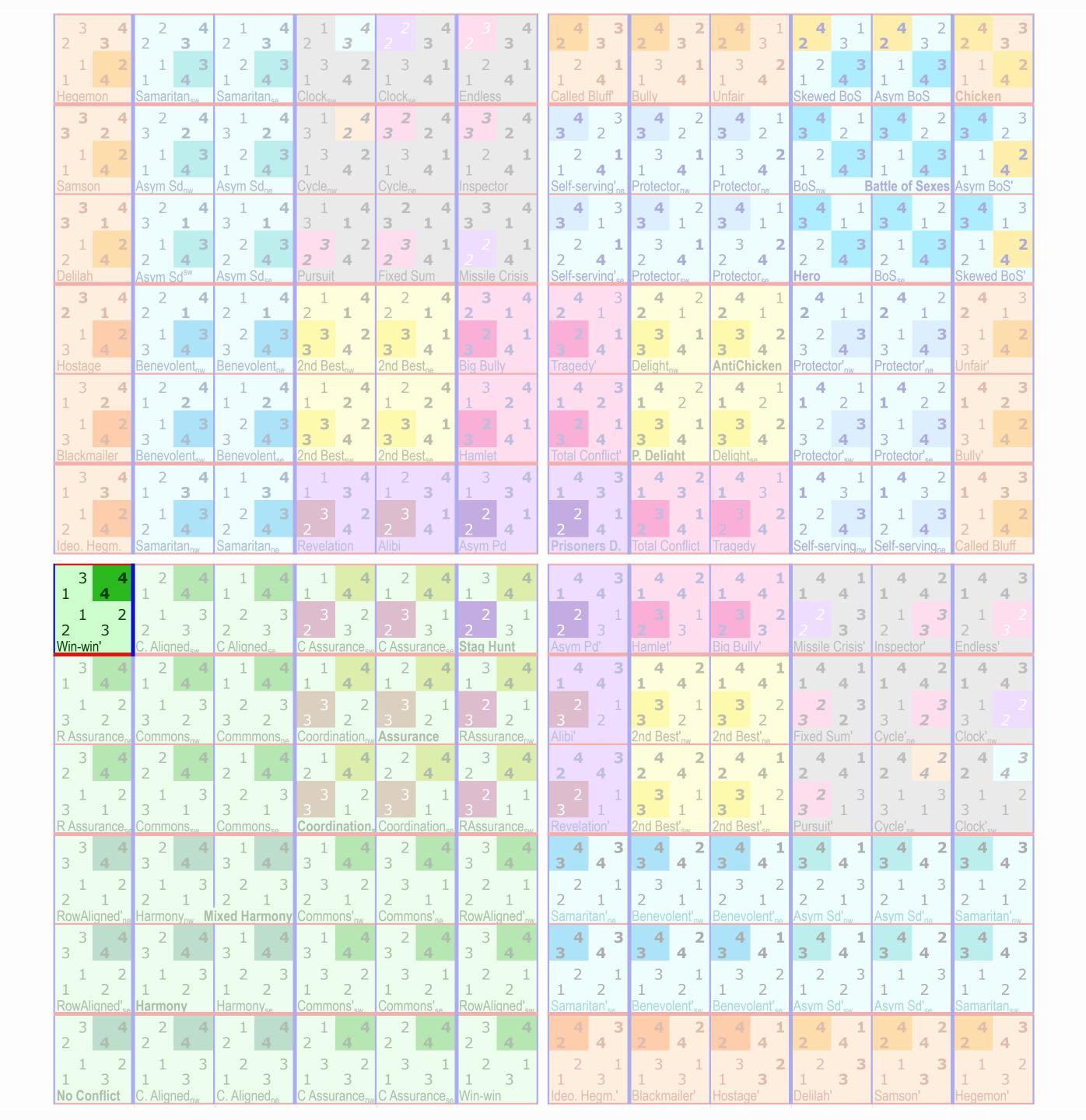


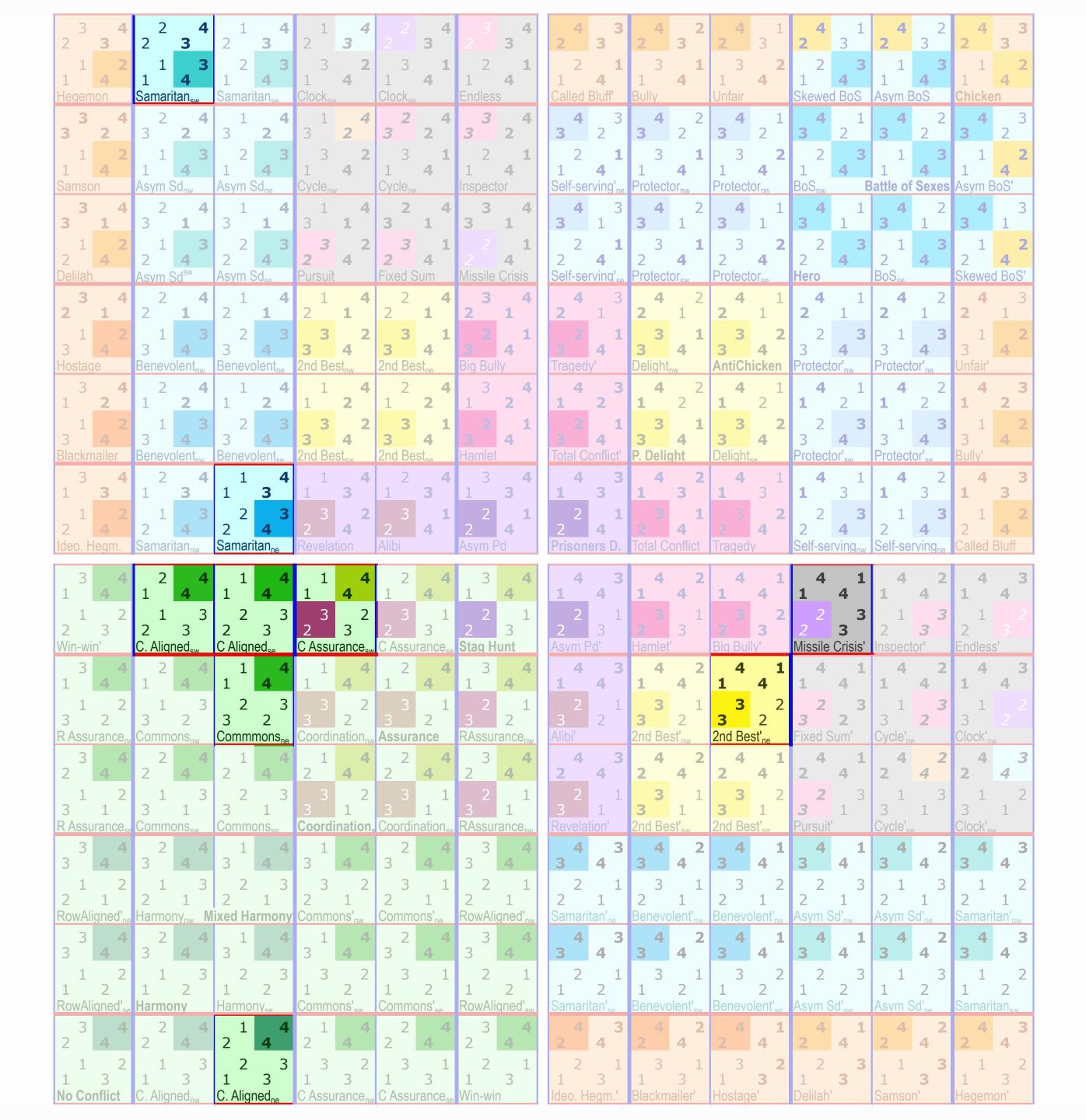


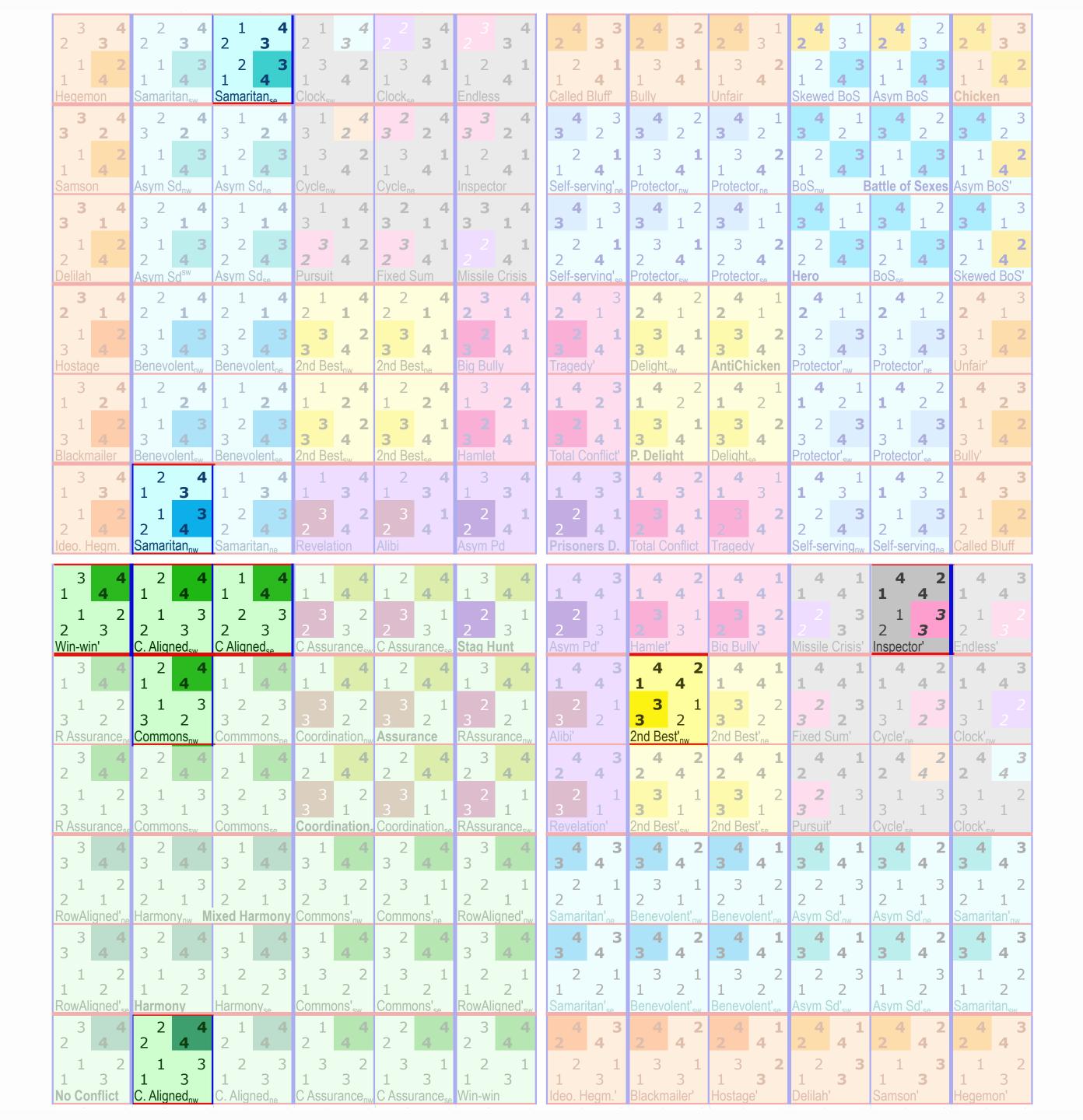


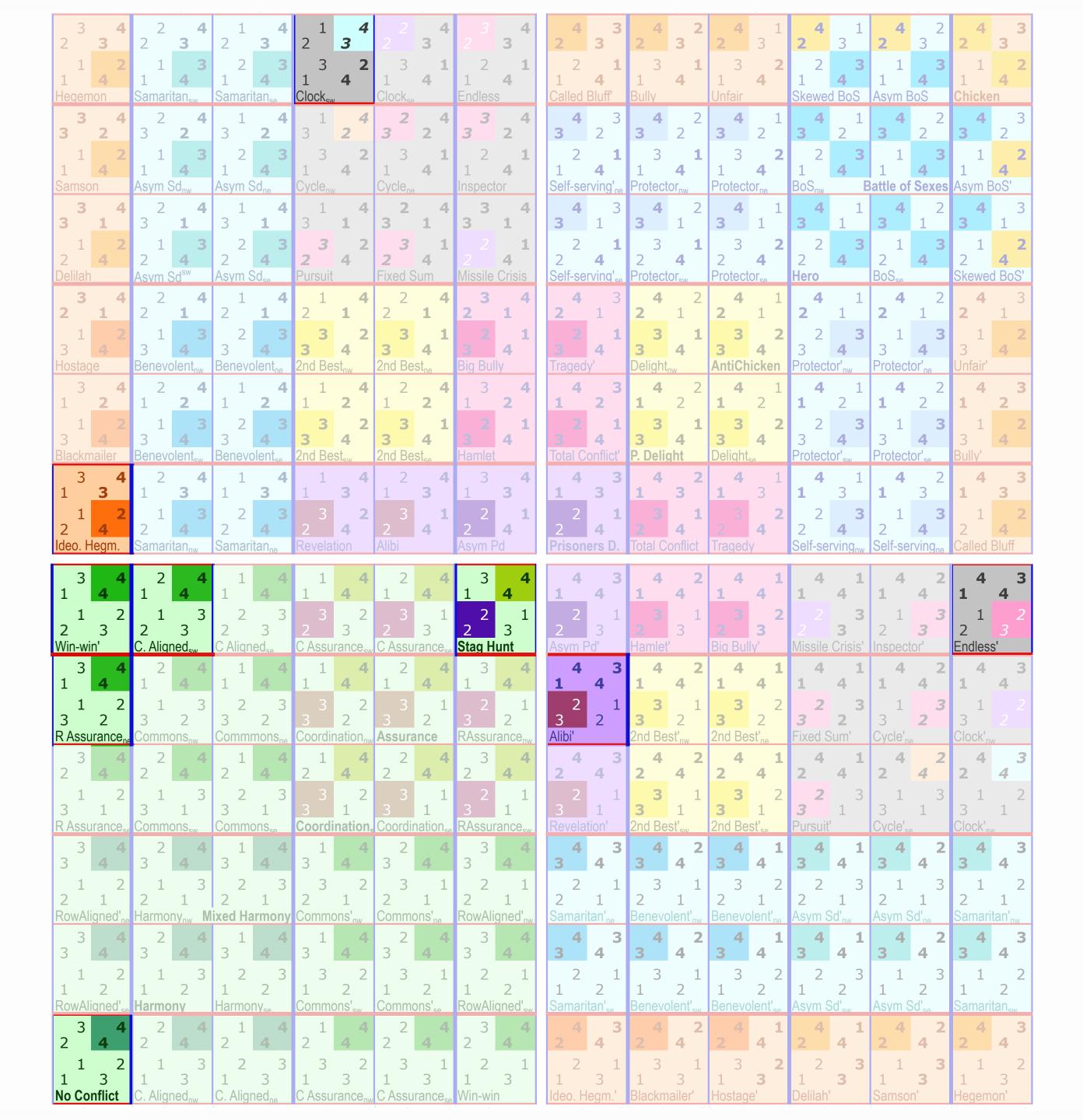


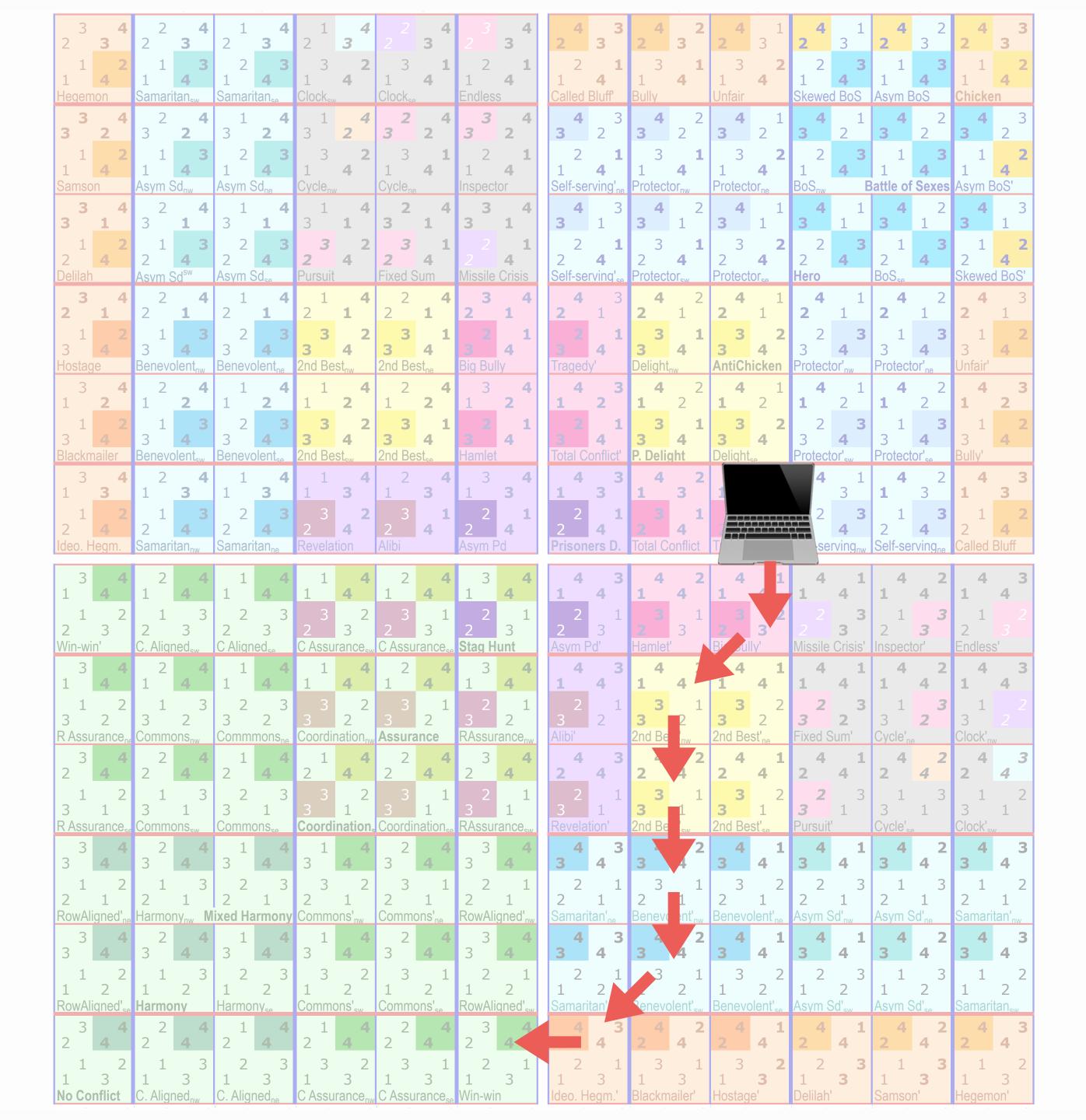










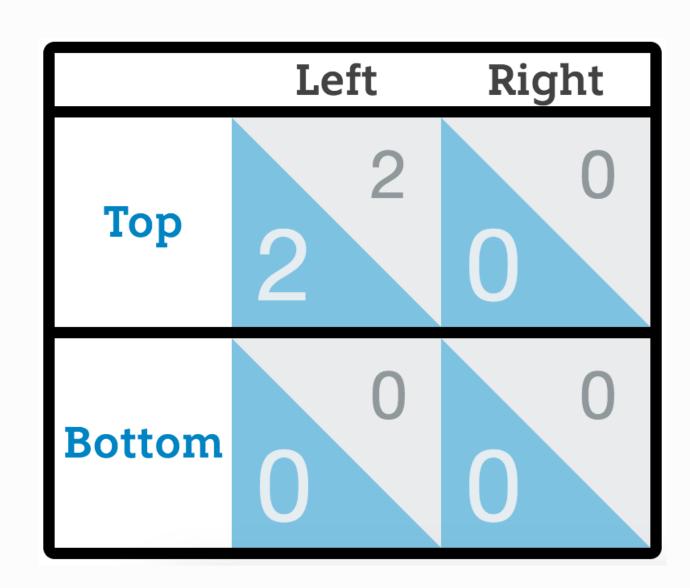


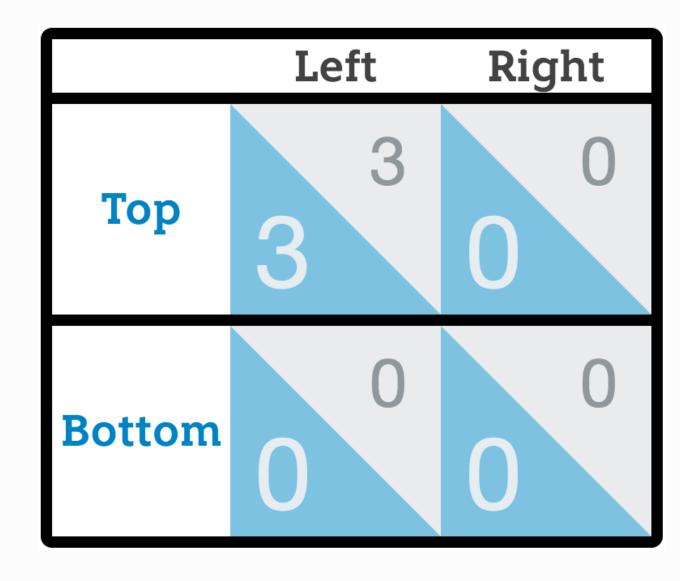
### Simple dynamic

#### Agent

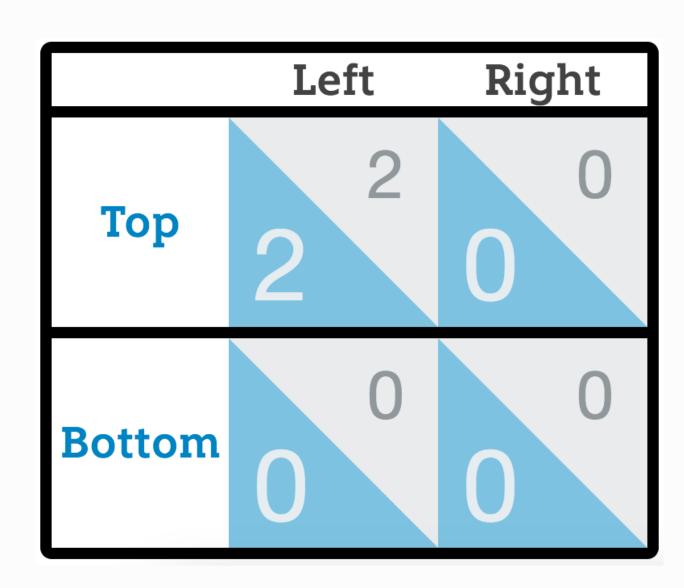
- —Compares all neighbors of a game based on its **features** as an institution
- —Chooses preferred neighbor
- -Repeats
- Converges on the end-product of institutional evolution

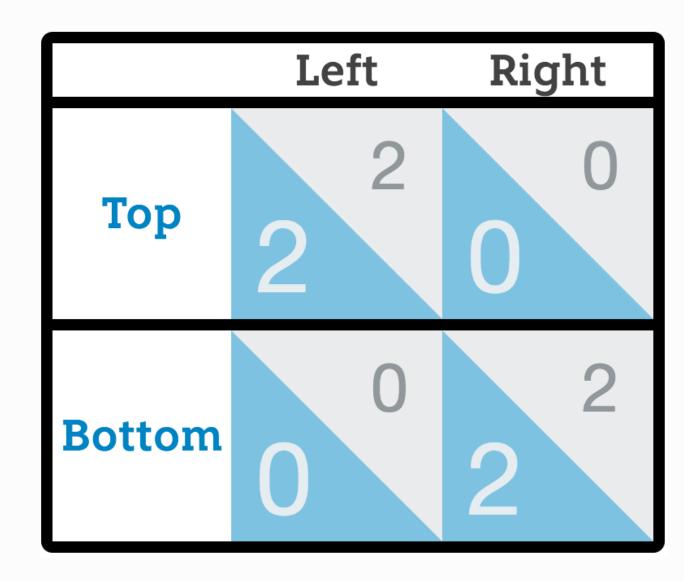
### Feature: Efficiency



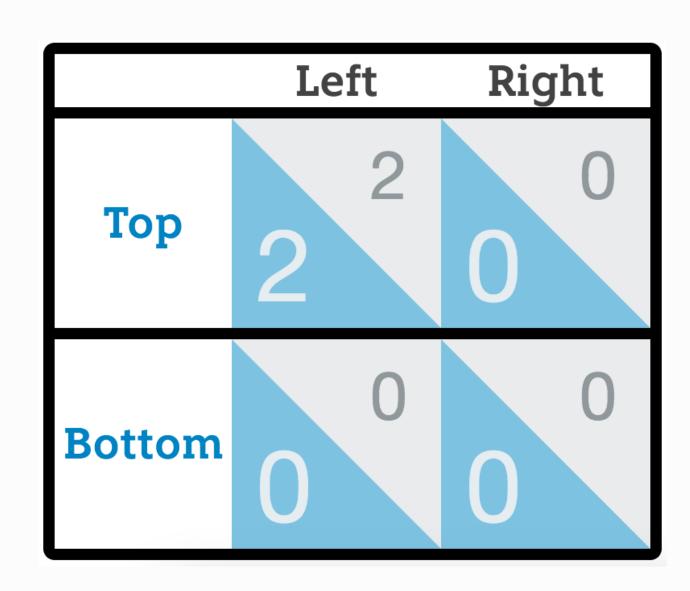


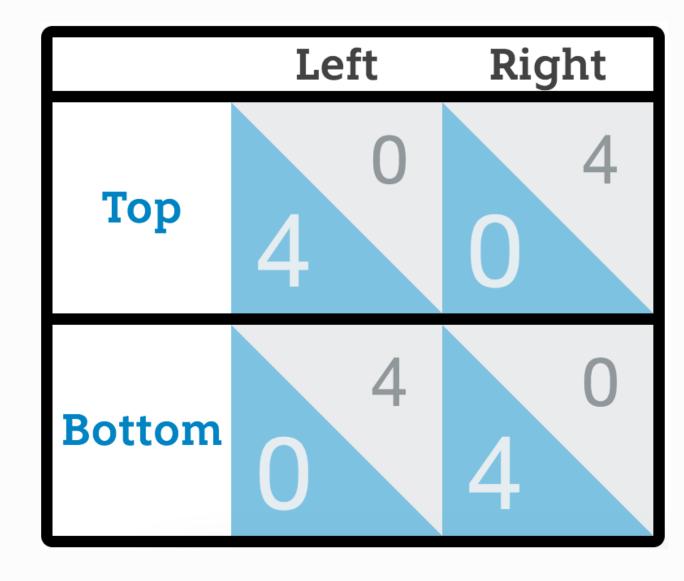
### Feature: Stability



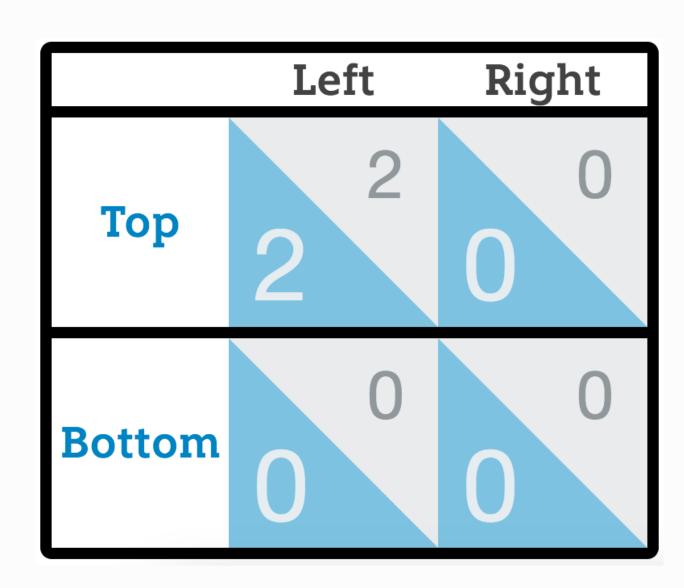


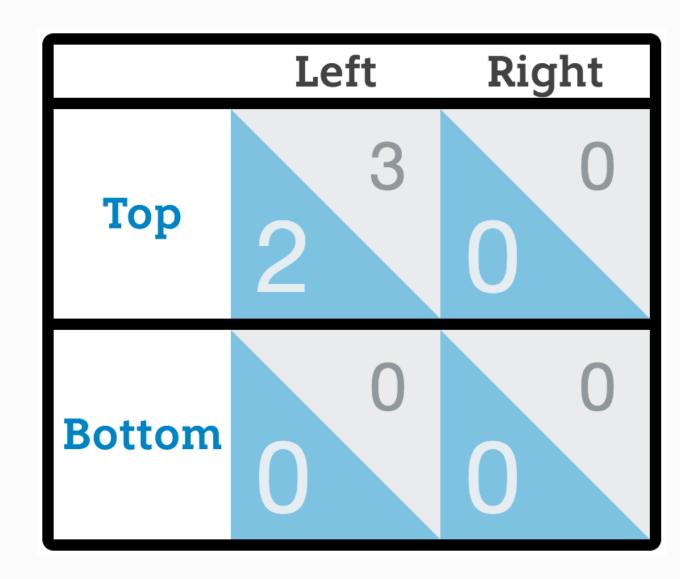
### Feature: Predictability





### Feature: Fairness



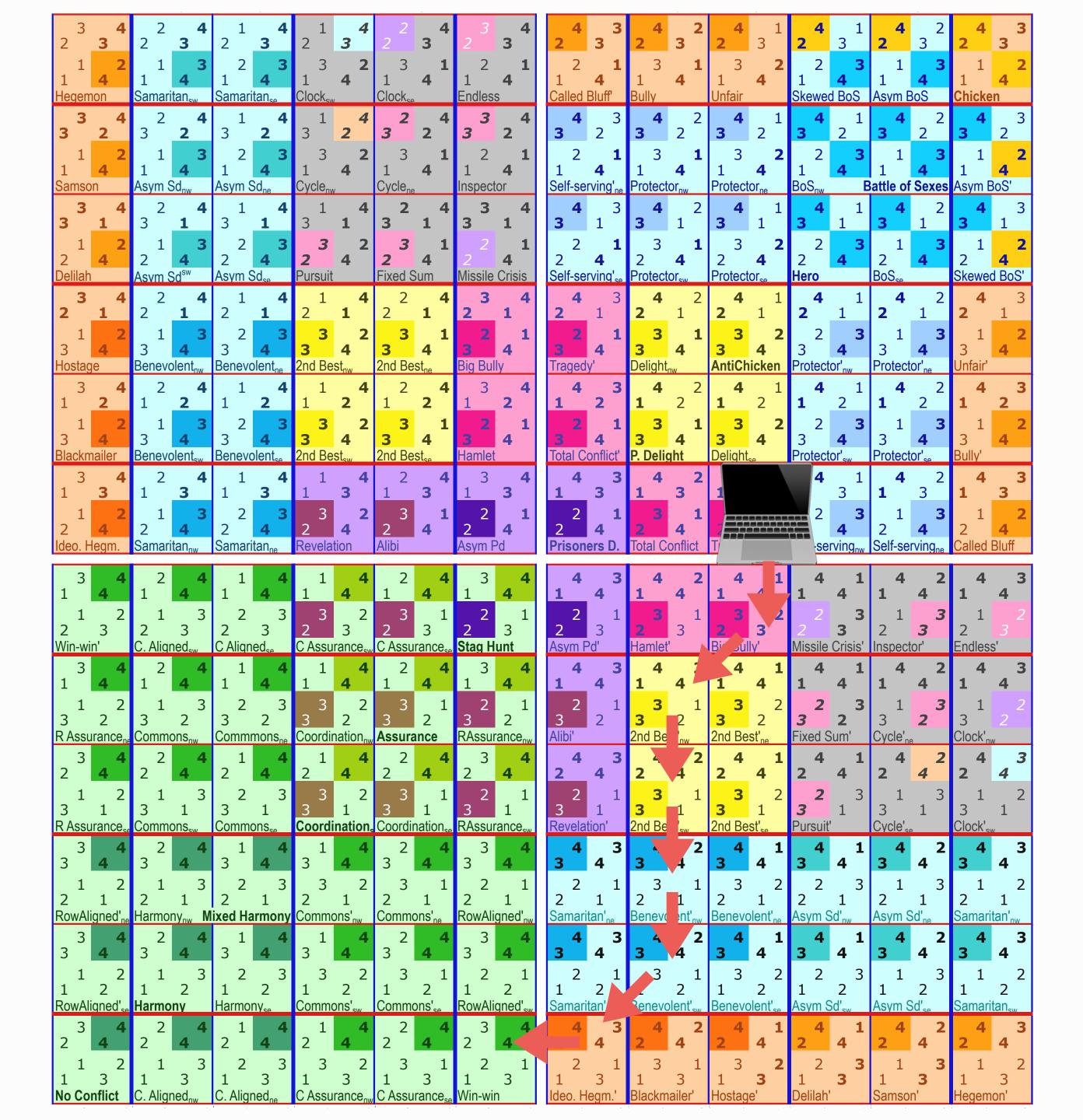


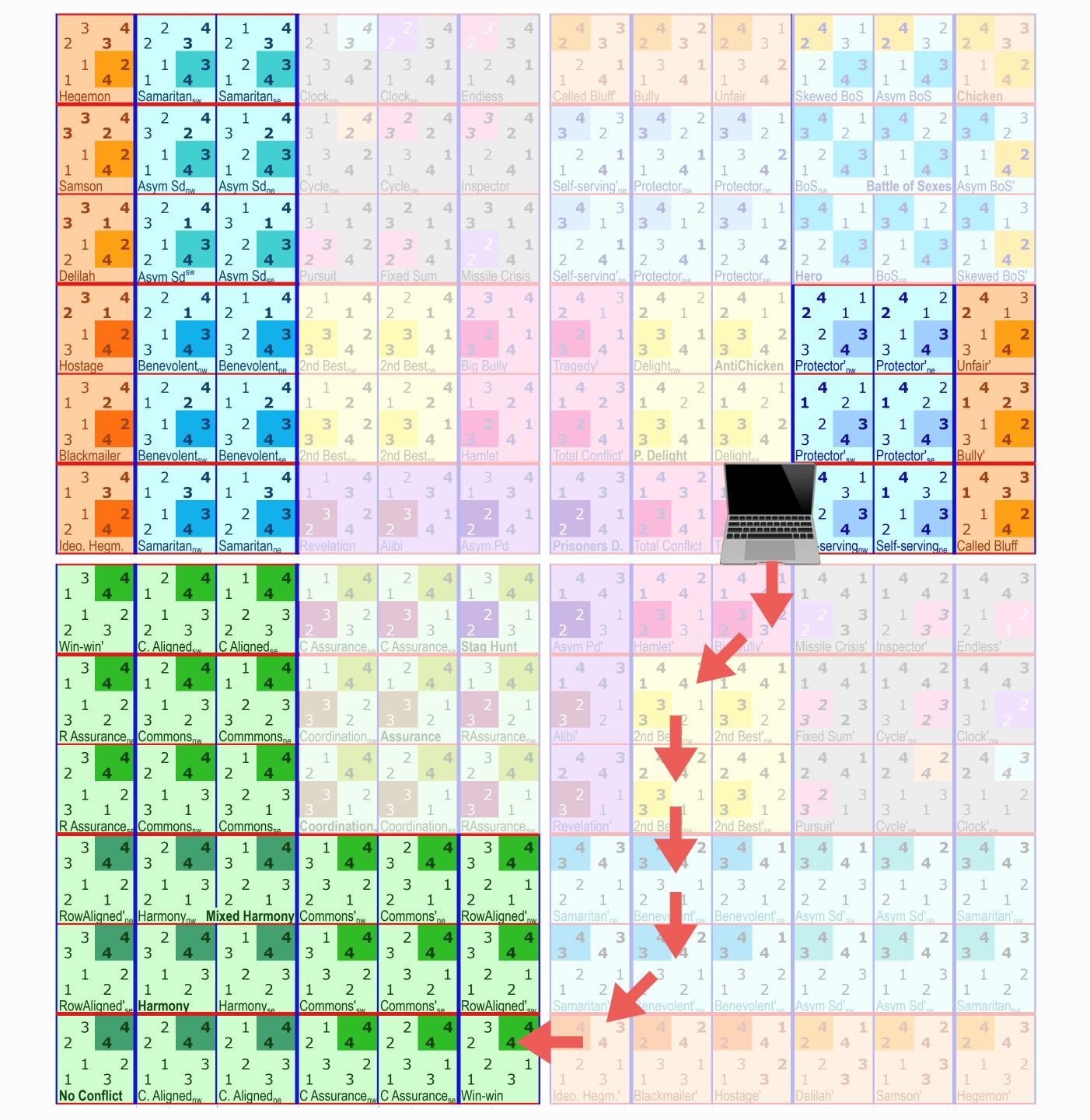
"Rational" within games and between them

### Simple dynamic

Agent compares all neighbors of a game:

- Stability: Prefer games with unique Nash equilibrium
- Predictability: Prefer pure Nash equilibrium
- **Efficiency**: Prefer games with most profitable equilibrium
- Fair: Social preferences



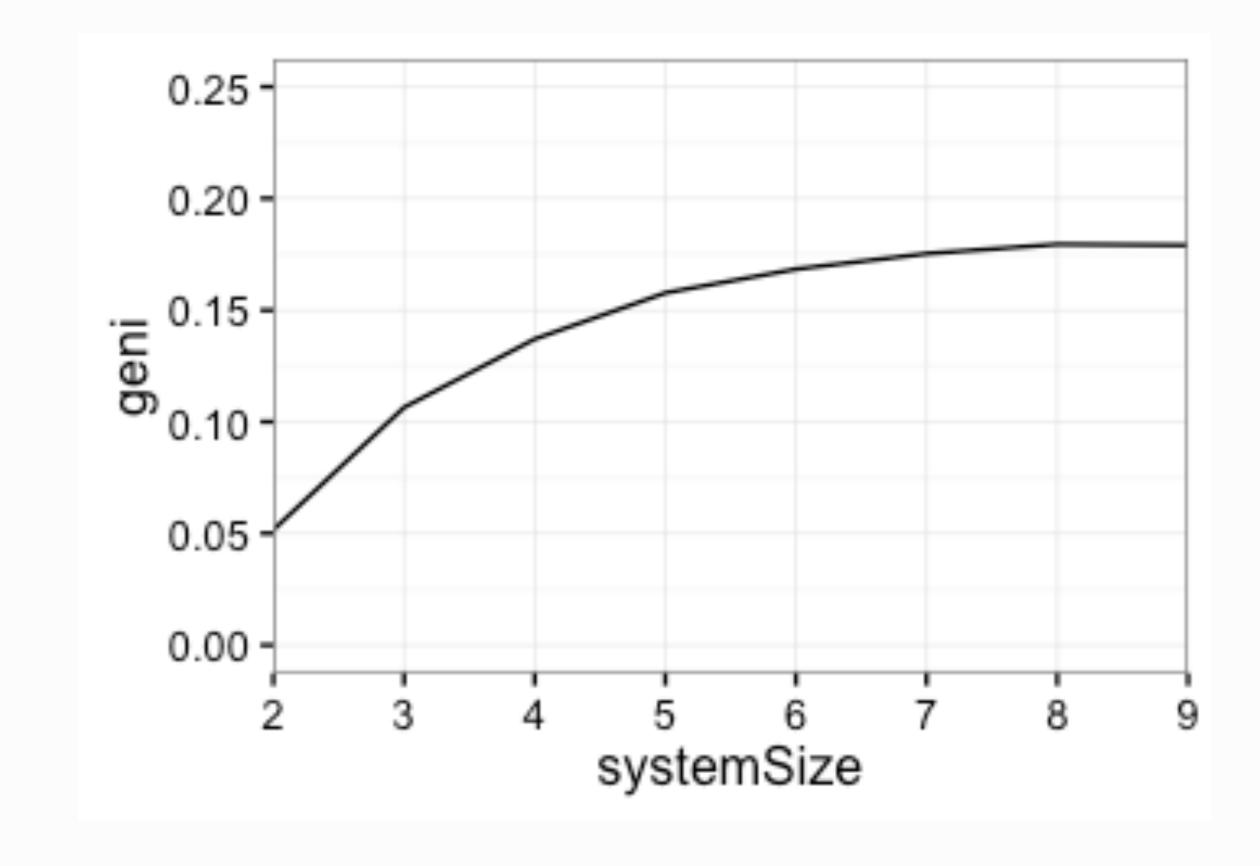


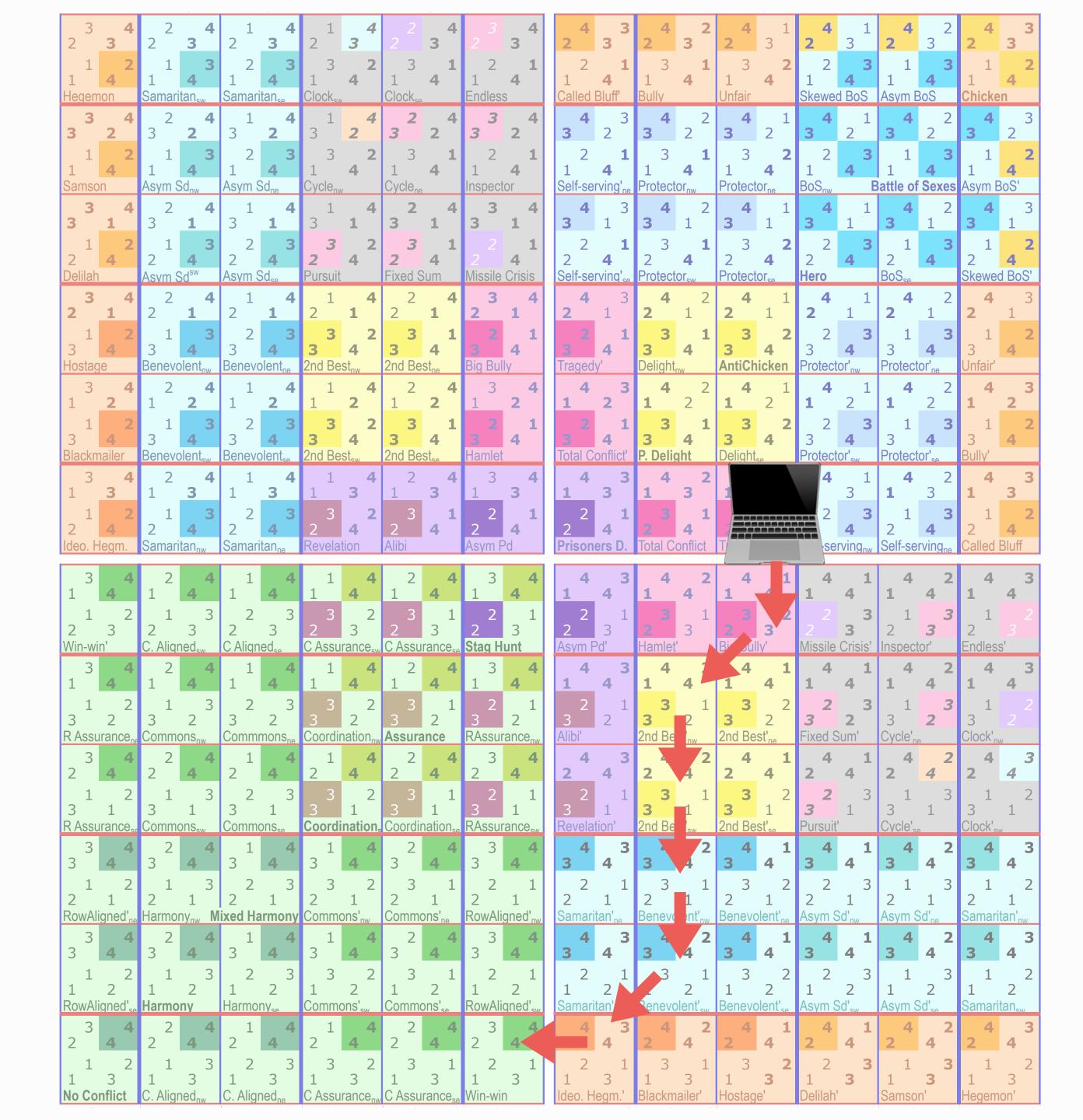
### Results

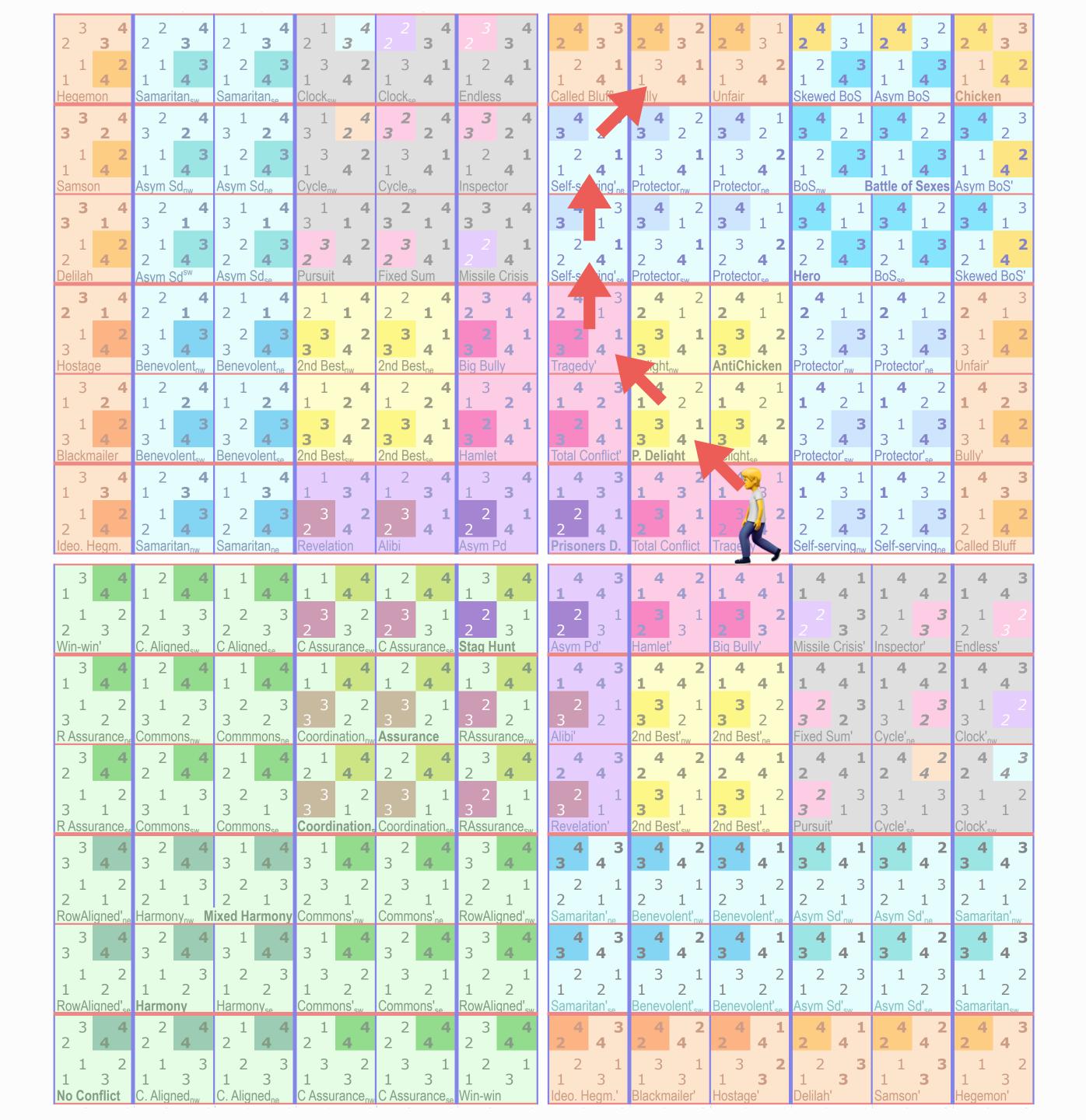
- Half of attractors are win-win
- —Despite no sense of fairness
  - ... because of the nature of the space
- The attractors form a contiguous basin

### Results

#### How does that scale?







#### HIRING!!!

email
sethfrey@ucdavi
s.edu
and
kj338@cornell.e
du

https://
psynet.dev

### Question

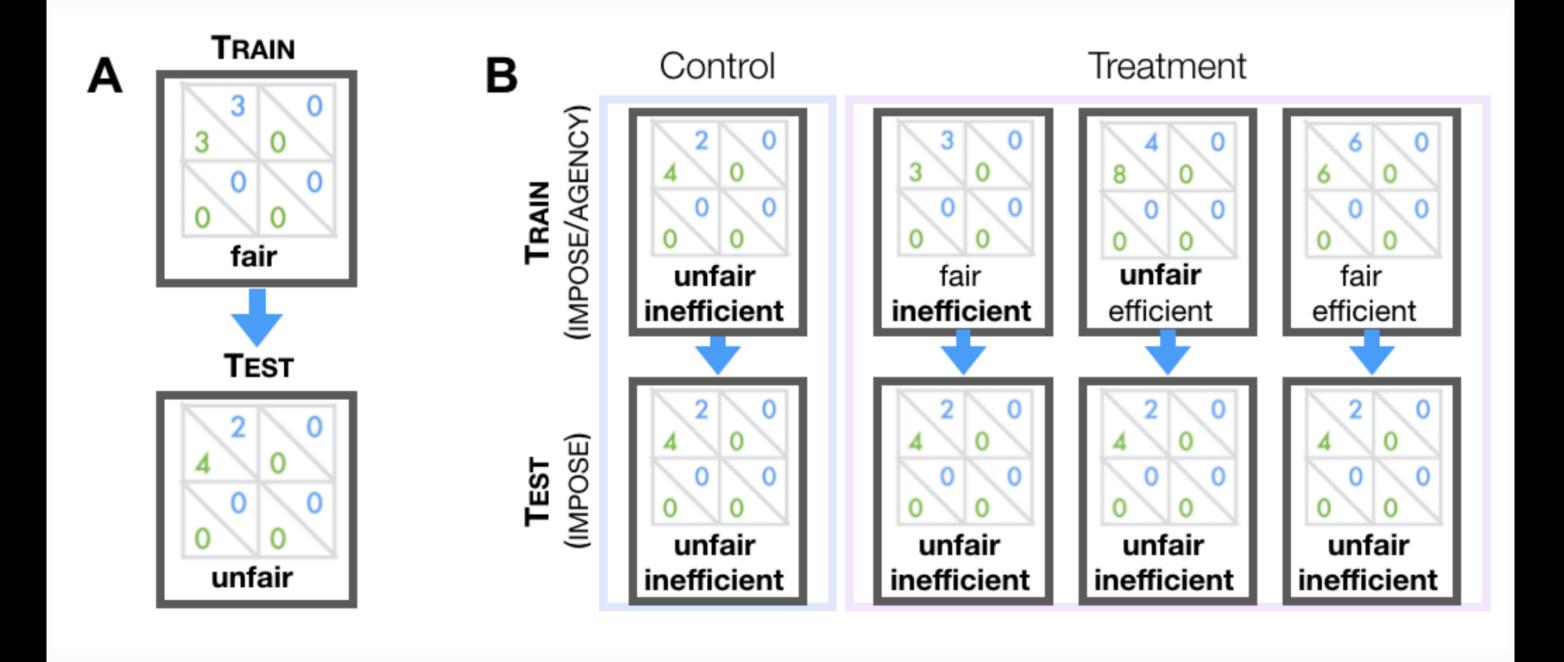
— What features do actual human beings favor in selecting between institutions?

### Prediction

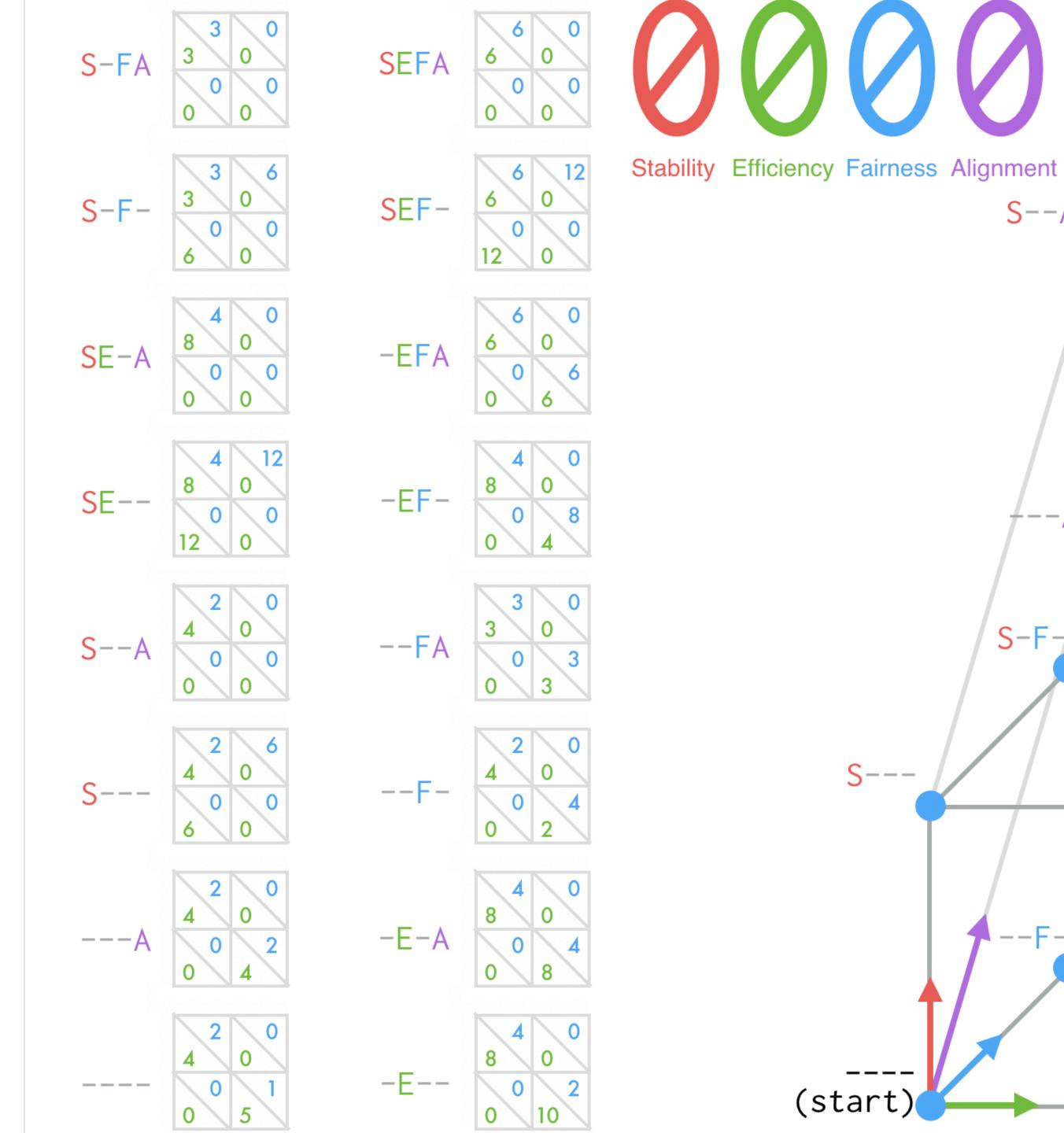
- —In *Natural Justice* (2005), Ken Binmore distinguishes """
  - ... three levels of priority made necessary by an evolutionary approach to social contract theory. The three levels of priority are
    - Stability
    - Efficiency
    - Fairness

"""(p.5)

### Design



### The space



S-FA

SE--

S--A

S-F-

SEFA

(end)

-EFA

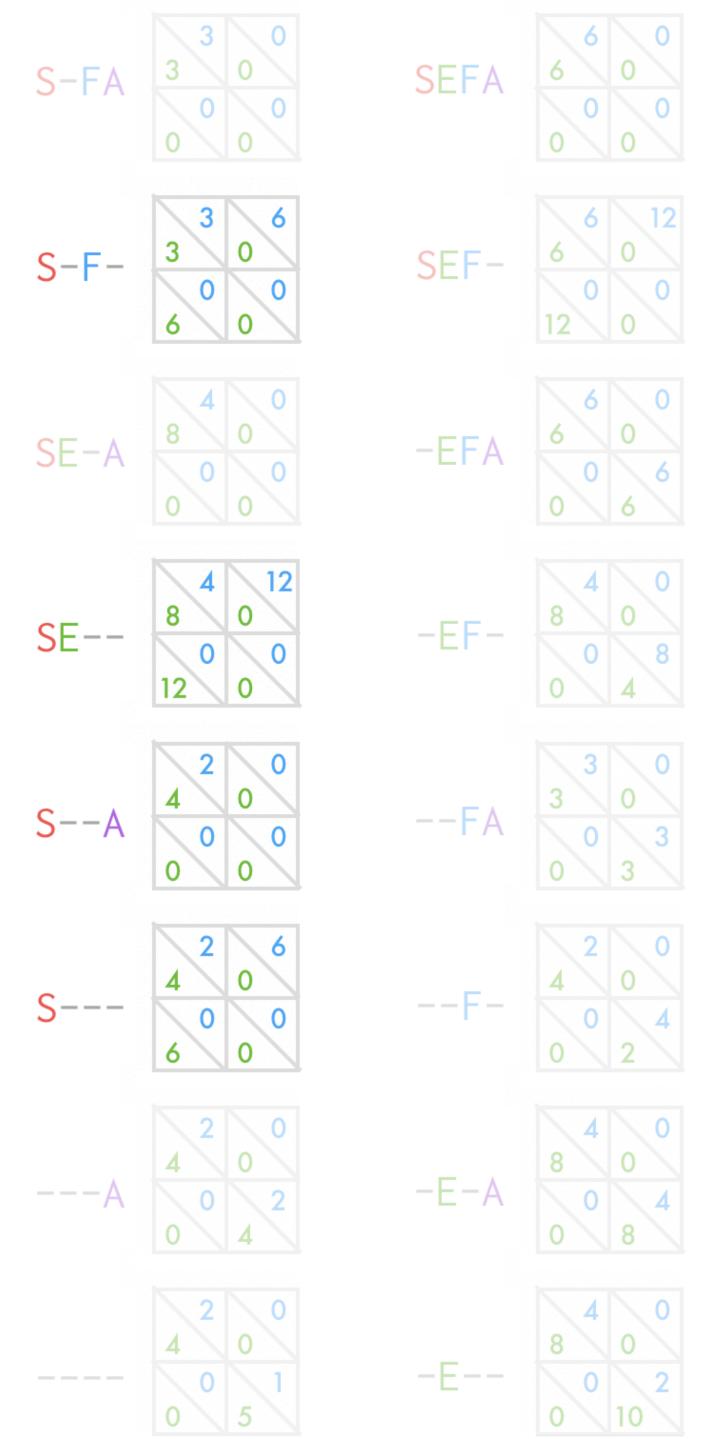
SE-A

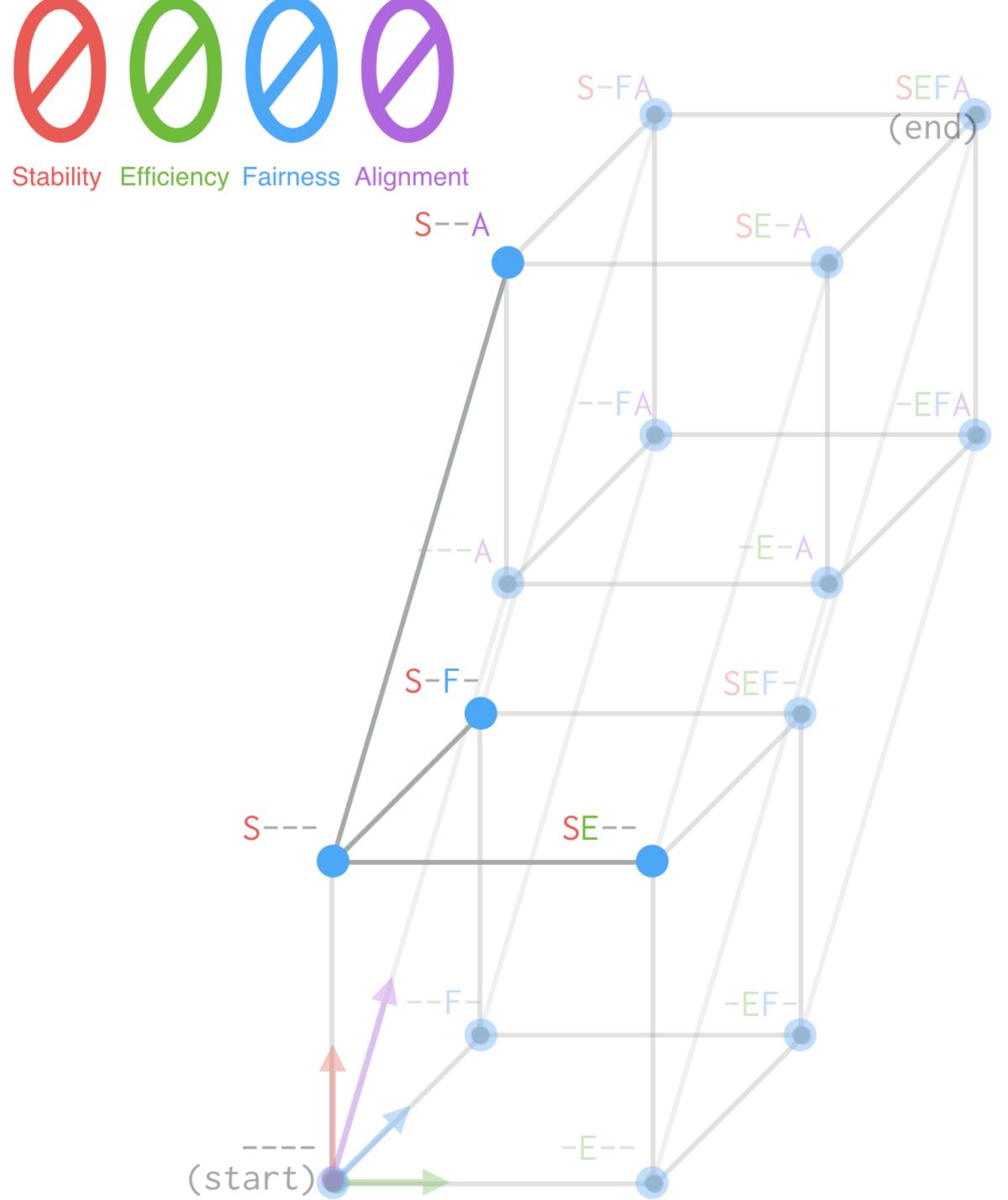
<del>/</del>E−A

SEF-

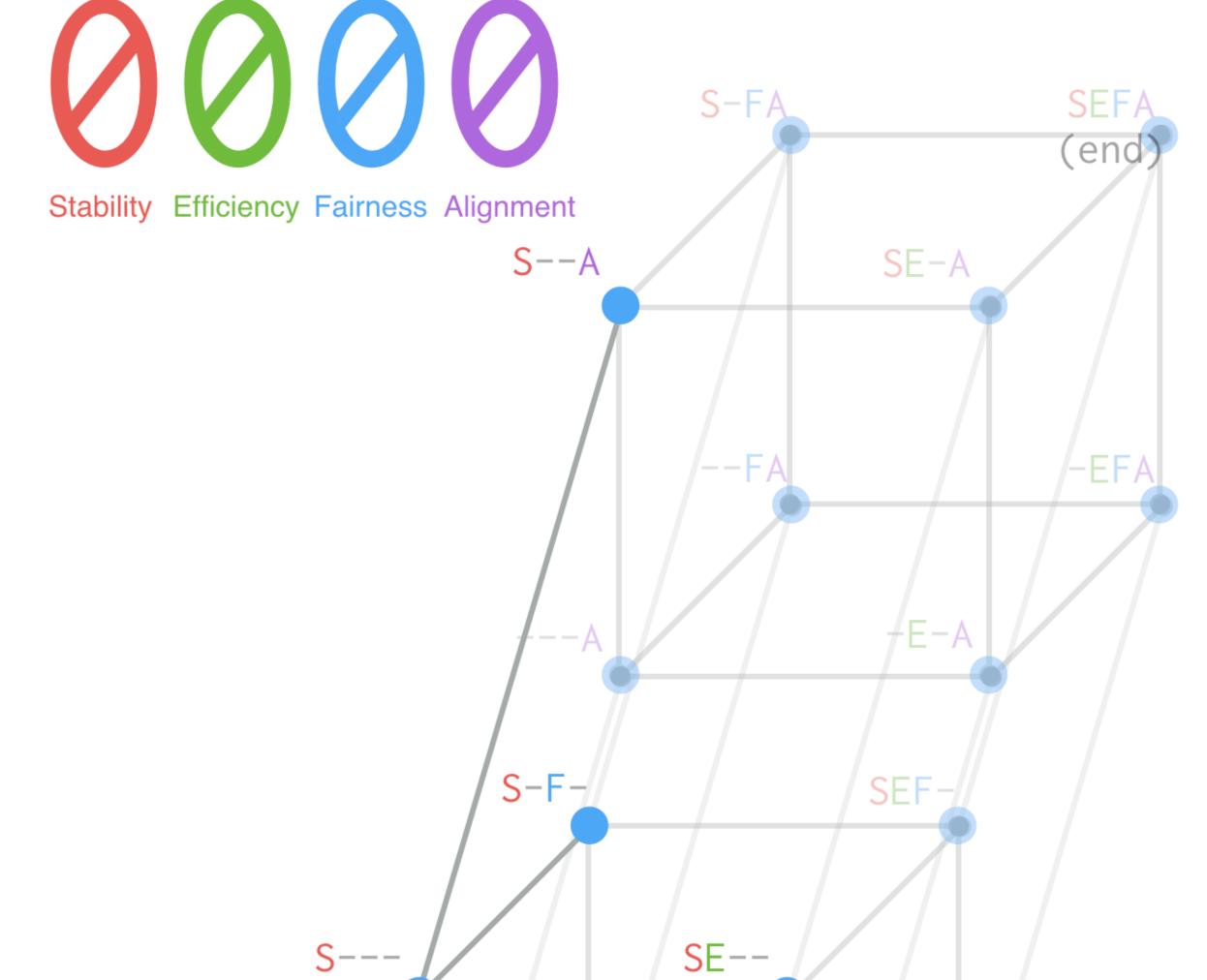
-EF-

### The space





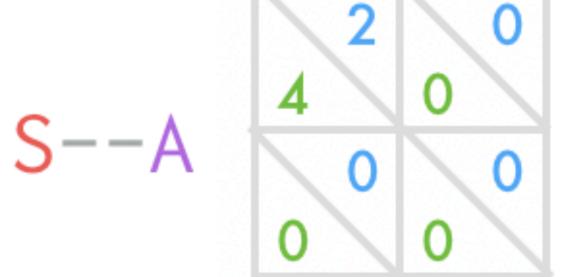




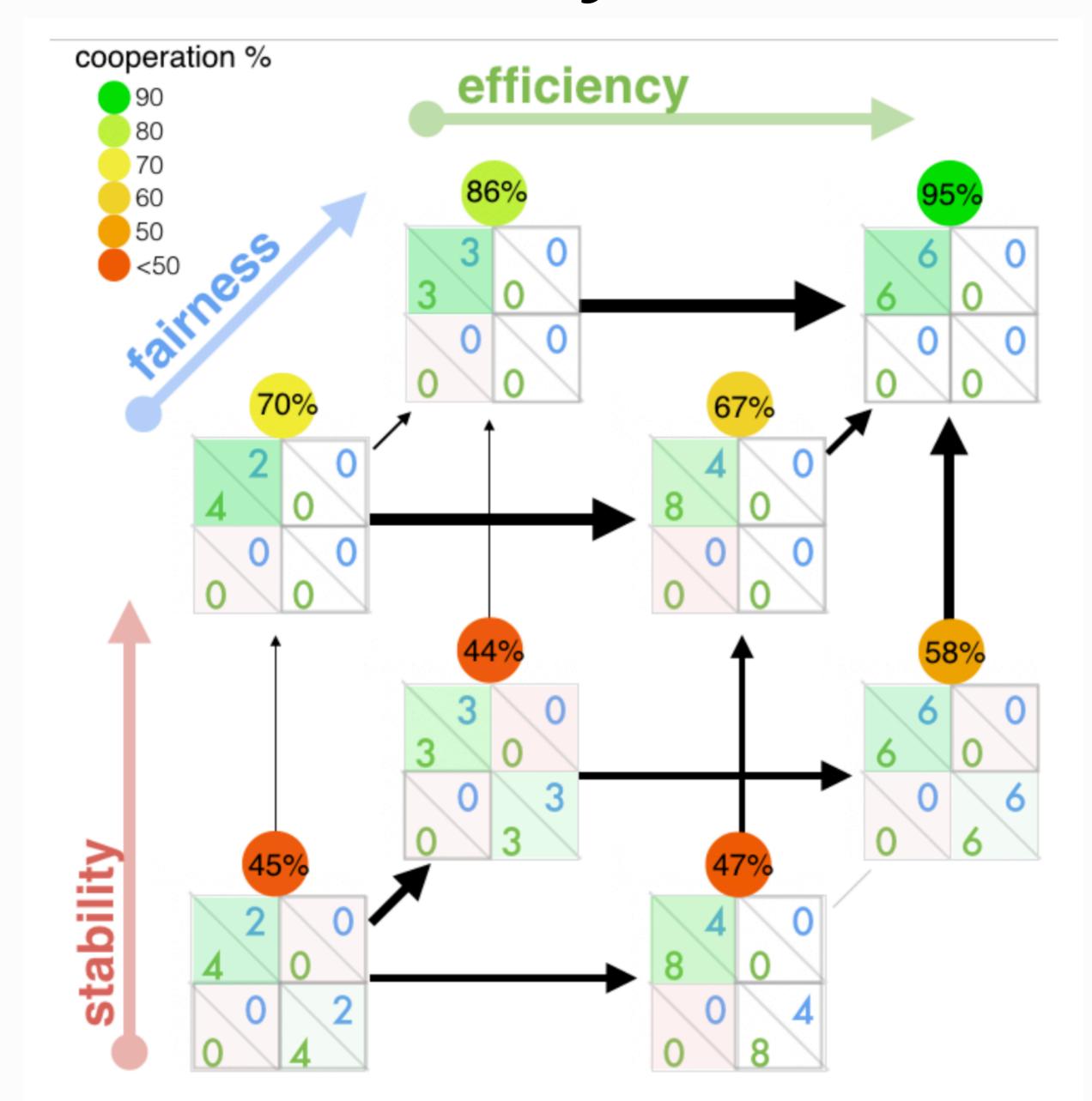
(start)

-EF-

	2 6
	4 0
S	0 0
	6 0



### Preliminary results



### Directions

- —Among self-governing institutions, how should governance style change with the size?
- How do we model the effects of individuals on the cultural evolution of institutions?
- What do people look for when they browse for social systems for participate in?

### Example motivation: Institutional layering

- Institutions grow by incremental accretion
  - Deletions are rare
  - "Edits" are rare
  - Big changes are rare
- This "algorithm" will find optimal rule configurations if rules don't interact
- Our evidence for interactions suggests that layering is vulnerable to local minima

### Takeaway

Understanding institutional change as a dynamic *over* systems offers a powerful, general, and empirically testable framework for the study of cultural evolution.

## Composing games into complex institutions

#### **Seth Frey**

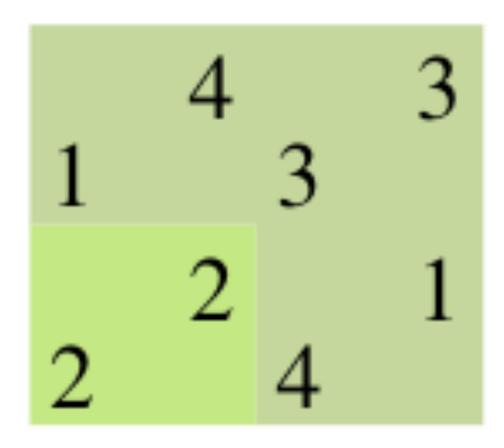
Communication, University of California, Davis with

Jules Hedges, Strathclyde University Joshua Tan, Oxford University Philipp Zahn, 20Squares

Frey, S., Hedges, J., Tan, J., Zahn, P. (2023) "Composing games into complex institutions" PLOS ONE https://doi.org/j3vs

### CAD for governance

- We can't yet formally represent real-world institutional complexity.
- We need it.
- Existing options fall short, including game theory.
- What does an extended game theory look like?



Prisoner's Dilemma

II. ♣ Congress  LEGISLATIVE STATUS STEPS*	
Senate	Sentatives A Bill
	Introductory Steps
	Steps  Committee Steps
	Discharge Steps
ing and a second	Calendar & Scheduling Steps
	Feer Wessure Steps
	Roar Act Steps
	Continuous Steps  Floor Conference Steps
	Presidential Staps
in E	Floer Veto Motion Steps
COMMUNICATION OF WALLEY CO.	$\Rightarrow$
	-

Frey, S., Hedges, J., Tan, J., Zahn, P. "Composing games into complex institutions" https://arxiv.org/abs/2108.05318

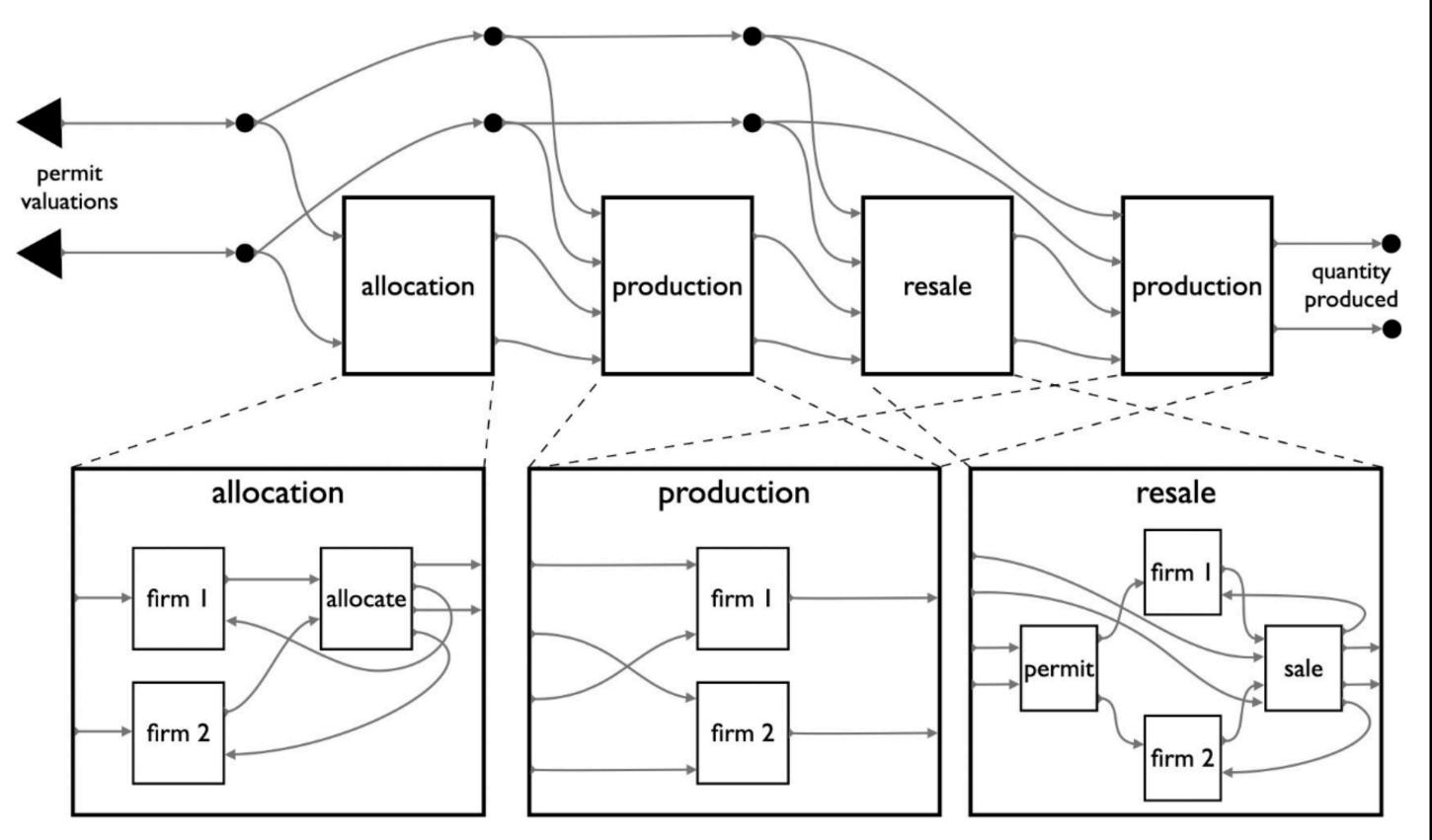
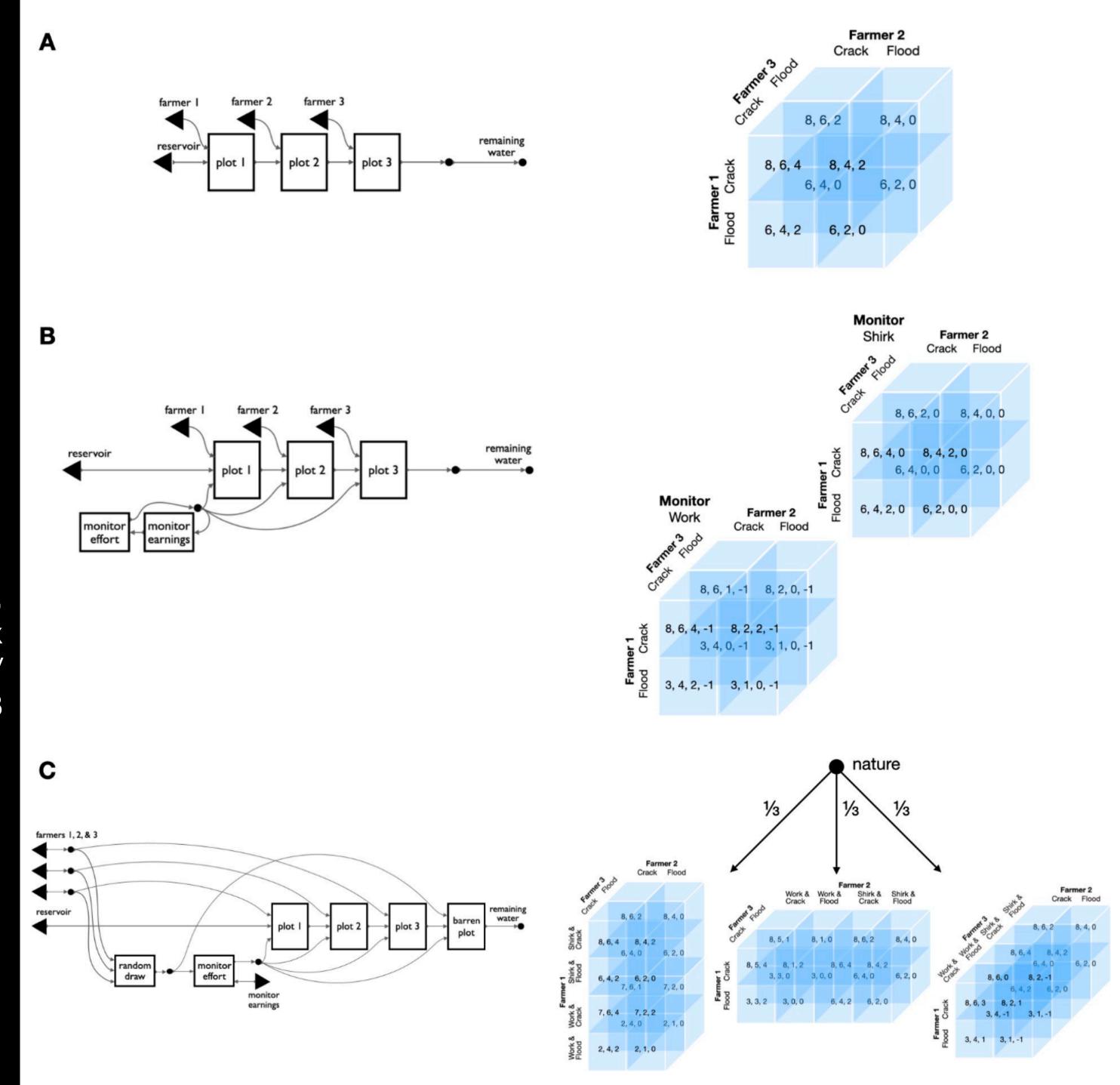


Fig 3. A four stage CO<sub>2</sub> market game. This multi-stage game proceeds through an initial allocation stage, a production stage, a resale stage, and a second production stage. The first models the primary allocation of CO<sub>2</sub> certificates to producers. Producers who received permits then decide how to use them in production. Afterwards, they either have unused permits left or are seeking further permits, and so participate in a resale market that is then followed by a final production phase. Producers operate under incomplete information: they do not know how highly others value their permits. With each stage represented as modules, stages like the production stage can be reused. The explicitly typed incoming (large left-pointing triangles) and outgoing arrows (terminating in circular nodes that represent the game's composability) make this complex of open games itself a game that could be opened and embedded within a larger game.



Frey, S., Hedges, J., Tan, J., Zahn, P. "Composing games into complex institutions" https://arxiv.org/abs/2108.05318

### Projects

Minecraft

Minecraft

Apache Software Foundation

12 platforms

Model and experiments

ABM

Formal framework

— What governance systems do communities design for themselves and what works with Bob Sumner

- Is governance change due to selection or drift? with Qiankun Zhong and Martin Hilbert
- "Do we run how we say we run" with Mahasweta Chakraborti
- What are the varieties of polycentricity? with Shagun Jhaver and Amy Zhang
- Institutional preferences with Ofer, Nori, Dalton, and Qiankun Zhong
- The psychological mechanisms of the tragedy of the commons with Christopher Frantz
- Composing games into complex institutions with Hedges, Tan, Zahn

Toolkit — NLP4GOV with Mahasweta Chakraborti

WITH ONLINE COMMUNITIES COMPUTATIONAL SOCIAL SCIENTISTS CAN TEST GENERAL PRINCIPLES OF INSTITUTION DESIGN AND PERFORMANCE

Rice D, Siddiki S, Frey S, Kwon HK, Sawyer A. Machine coding of policy texts with the Institutional Grammar.

Public Admin. 2020;1–15.

<a href="https://doi.org/ghzpst">https://doi.org/ghzpst</a>

Chakraborti, M., Bonagiri, S. A., Virgüez-Ruiz, S., & Frey, S. (2024, May). NLP4Gov: A Comprehensive Library for Computational Policy Analysis. In Extended Abstracts of the CHI Conference on Human Factors in Computing Systems (pp. 1-8). https://doi.org/mxqb



#### Institutional Grammar Research Initiative

https://institutionalgrammar.org/ https://cisl.info

#### Schneider, N., Tan, J., Frey, S., De Filippi, P., Zhang, A. X. (2021) Modular Politics: Toward a Governance Layer for Online Communities. CSCW

Frey, S., & Schneider, N. (2021). Effective voice: Beyond exit and affect in online communities. New Media & Society. https://doi.org/gwpb

Jhaver, S., Frey, S., & Zhang, A. (2021). Decentralizing Platform Power: A Design Space of Multilevel Governance in Online Social Platforms. https://arxiv.org/abs/2108.12529

Frey, S., Hedges, J., Tan, J., Zahn, P. "Composing games into complex institutions" https://arxiv.org/abs/2108.05318

# The Metagovernance Project



https://metagov.org/

# Thank you

# Online communities as model systems for commons governance

**Seth Frey** 

Communication, University of California, Davis



