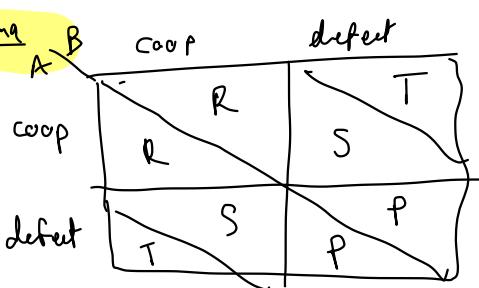


## Wikipedia: Prisoner's Dilemma

generalized version:



relationships:  $T > R > P > S$

for iterated game, we require  $2R > T+S$  so that cooperation is better than alternating.

iterated prisoner's dilemma also known as: peace-war game  
so yes, OK, my point about how scoring depends on the other submitted algorithms makes sense.

what if we only allow finite alternation players?

the tournament format also matters a great deal  
— if right elim, over a "don't care" strat like  
always - defect  $\Rightarrow$  dominant

maybe something can be said about what happens if we're given a distribution.

why does the evolutionary approach make sense?

↳ because it captures how meta game usually develops going back and forth

also, if no progame is made in the evolutionary game then things would be perfect

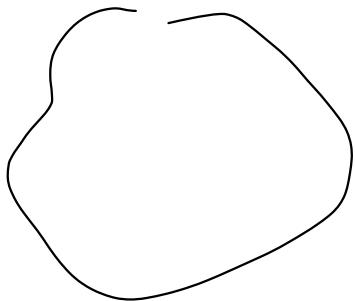
→ I DO EXPECT, however, that no such situation actually exists.

### Possibly interesting question:

Does there exist a collection of strategies for which no outside strategy exists that would outperform them?

$N$  rounds (maximized)

(how this does not really capture what I want because a strategy could identify itself and fit for that and do well against it)



cloud of defects

T

N.P

N.T

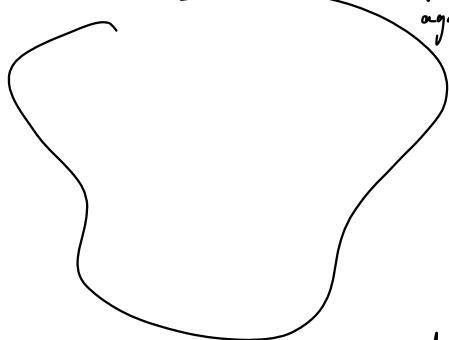
N.S

P+T

? S+R

hummm. I kinda like the way this is set up.

↑ wait. can be solved by saying that we just play a strategy against itself.



cloud of cooperators

N.R

win against ever 1 defect-cooperative point.

or point.

## Axelrod: paper 1

"what is effective is likely to depend not only upon the characteristics of a particular strategy but also upon the nature of other interactants."

what seems like a reasonable  
evolutionary way to code it this:

→ start with a bunch of  
strategies

→ in every step, add a  
strategy that would win  
and remove the loser

questions: 1: would this procedure  
produce an equilibrium?

2: would this equilibrium  
always be the same?

Answers

BK so Sipser's idea is  
to restrict to finite automata.

hmm.

what is my idea?



play against each other + against itself.

why? if only against each other there is  
no reason to cooperate!

---

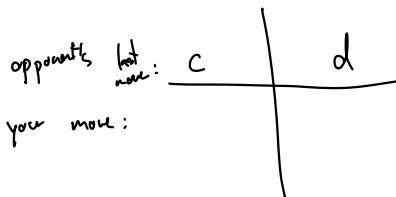
let's say we only can remember last move.

so cc cd dc dd

move:

$2^4$  different strategies.

let's just say you only can base it on opponent (at first)



your move:

cc ← tiebreak  
cd  
dc  
dd

cd:

cd ↔ cc tie  
cd ↔ dc

yeah so  
bit-for-bit  
clearly optimal.

R S T

	P	(finite case)
cc R	5	
cc S	3	
dd T	1	
dd P	0	T > R > P > S and R > S > T. S.

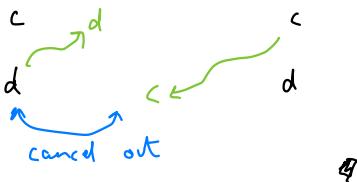
---

claim: TFT loses w/ at most T-S pts against my other strategy.

proof:

TFT:

other:



q

---

claim: for deterministic strategies, if  $P_1$  is played against its cube  $P_2$ , then  $P_1$  and  $P_2$  get the same result.

proof: they'll just do the same thing

---

corollary: self-playing games are just cc's and dd's.

---

corollary: in order not to loose against TFT, a strategy needs to play only cc's against itself (and possibly a few dd's)

— d

4 rounds.

let's do ccc d.

then: against TFT:  $+ (T - S)$

against itself:  $- R + P$

so net:  $T + P - R - S > 0$

so that strategy is better than TFT,  
in this model.

oh but it is worse than other strategies.

so TFT > DD > LASTD > TFT

could say: we have finite automata.

then eliminate LASTD

could also say: don't know when we  
will end

def A wins against B if  $\exists N$  s.t.

for all  $n \geq N$  A wins over B in an  
 $n$ -length game.

know what about a strategy tit:

d first round. if opponent  
also d's then always c.  
if opponent c's always d.

so I guess this approach doesn't  
work either.

and in all scenarios I think  
there will exist degenerate strats  
like these that win against TFT.

maybe then the best option is  
to play everyone against everyone?

simple finite automaton



why is O a worse strategy than  
TFT?

because it loses to PD?

hmm ok let's try everyone-against-everyone.

what does that mean?

I'm computing ~~the~~ average score

against all possible strategies

— a term I will have to

define.

ya ok, this actually makes some sense.

$$\begin{matrix} \text{cc} & \text{cd} & \text{dc} & \text{dd} \\ \text{cc} & p_1 & p_2 & p_3 & p_4 \\ \text{cd} & . & - & - & . \\ \text{dc} & . & - & - & . \\ \text{dd} & ; & - & - & - \end{matrix} := A$$

$V \cdot A^n X$  ← answer, kinda.

$Ax$  so becomes:

$$V \cdot (A + A^2 + \dots + A^n) X$$

OK, play against every possible strat.

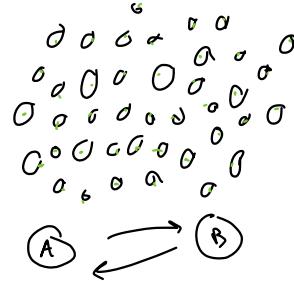
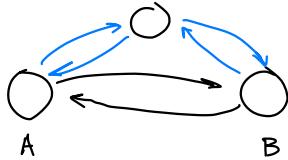
c	c	d	d
c	d	c	d

every possible strategy: all-d always best.

because the problem is that we include stupid strategies that smart strategies will not do so well against.

hmm so I guess that means, ...  
that we're back to square 1.

OK new goal: construct ANY context in which TFT would win.  
(no matter how specific and stupid it is)



okay maybe this: A wins against B  
if A wins the majority

$$\begin{pmatrix} & 1 & 0 \\ & \vdots & \vdots \\ 0 & \dots & N \end{pmatrix} \begin{pmatrix} & 1 & 0 \\ & \vdots & \vdots \\ & \ddots & \vdots \\ & 0 & 1 \end{pmatrix}_{N+1}^{N_4}$$

$x_1 =$   
oh sure it seems determined.

$$x_{N-1} = \frac{P_{N-1, N} + P_{N-1, N-2} \cdot x_{N-2}}{1 - P_{N-1, N-1}}$$

oh it's not obvious but I guess provable  
by induction.

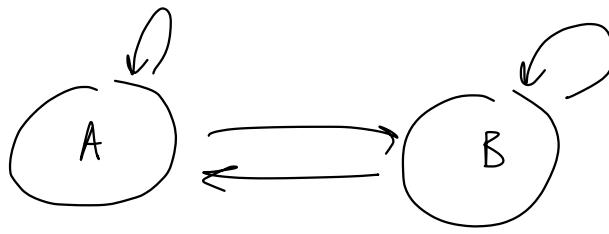
the only stationary vector should be

$$\begin{pmatrix} 1 \\ 0 \\ \vdots \\ 0 \end{pmatrix} \text{ and } \begin{pmatrix} 0 \\ \vdots \\ 1 \end{pmatrix} \text{ right?}$$

not obvious

oh oh it is obvious: at every  
step we're looking into the end  
of the row, so can't have stationary distribution  
if is not zero on middle entries

this idea is  
very appealing.  
so this actually  
models



we want to prove something about this

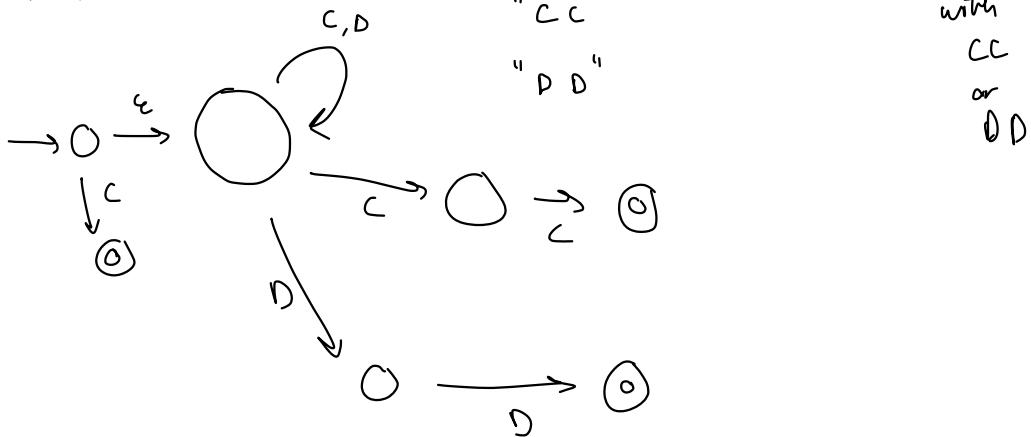
so, it will be hard to show that one strategy is "optimal".

can we formulate as a normal DFA

e.g. "accepts iff  $s[-1]$  is the action taken against  $s[:-1]$ "

yes. this would enable us to use NFAs now.  
maybe even extend this to PDAs and CFGs?

TFT:



what are the relevant definitions at play?

### evolutionary stability

$\hookrightarrow x^*$  becomes relevant

this definition  
deals with infinite-  
essentially switch  
addition,

OK so the paper captures essentially  
everything:

- (1) to be ES, you need  
to cooperate w/ yourself
- (2) there exists an ES  
strategy

All in Parlour net decides to me.

possible follow-up:  
is that strategy  
unique?

hmm so problem is  
that infinite-infinite seems degenerate



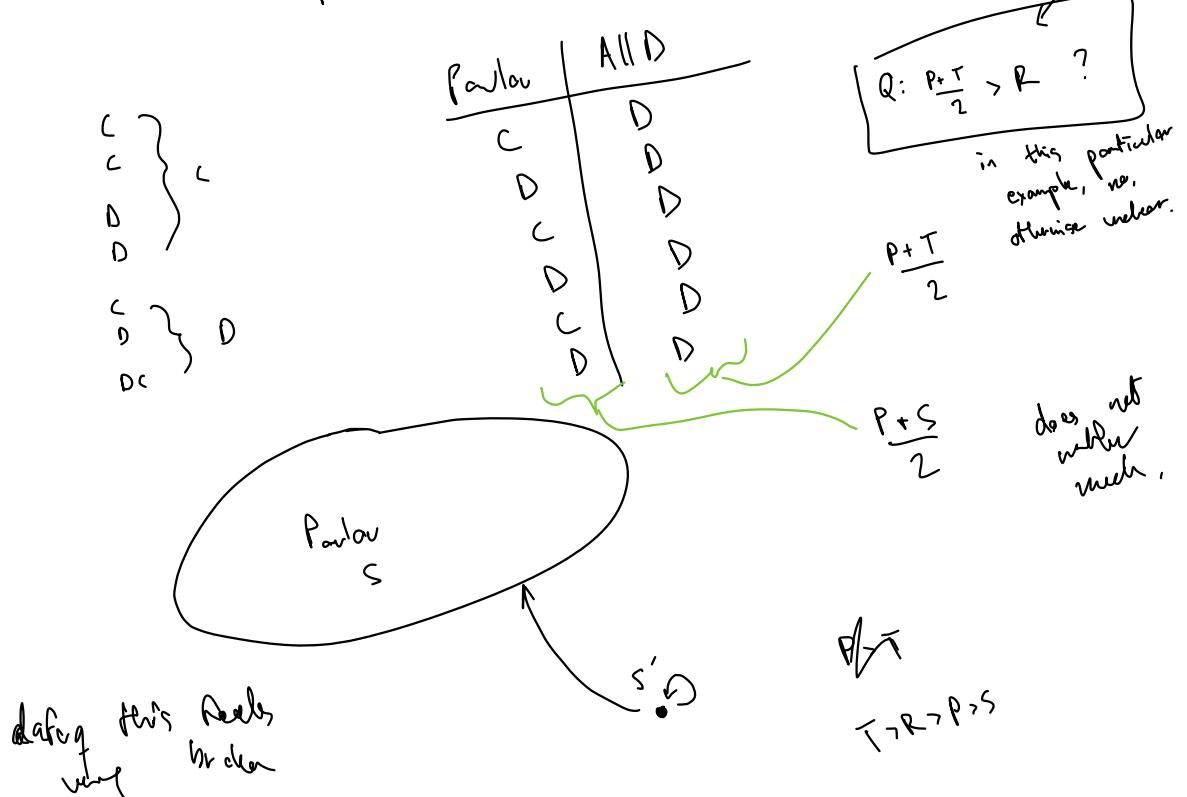
- (1) either imite the provider is better against provider than provider is better against provider
- (2) imite provider is equally good against itself + then provider is against itself

wait so in the infinite game it  
is obvious that TFT is evolutionarily  
stable because it only loses by  
a little bit.

$\hookrightarrow$  there's still, however, a possibility  
of other strategies existing  
(i.e. other strategies are  
at best off)

which would be  
impossible to ever  
however

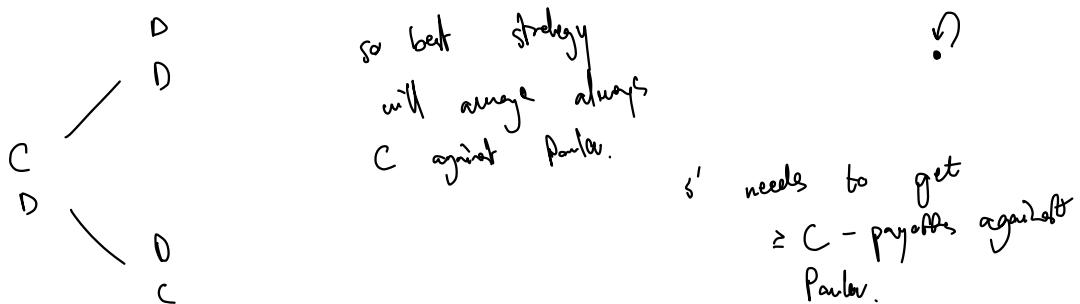
OK, how to prove that Pauler is ES?



during this needs  
when broken

$$v^m(s, s) = u^* \quad \forall m.$$

$$v^{m^*}(s', s') > v^m(s, s) ?$$



oh ok, clear that flows out  
workers.

oh so against mostly - D: do mostly - D until  
mistake, then fit-fit-fit

human oh so double-Pavlov is also ES.

yeah oh, really any strategy for what

$$V^m(s, s) = u^* \quad \forall m$$

is going to be ES under this  
definition

and that is really super easy because  
you can keep track ... wait no, you can't  
keep track of all mistakes

so really, Pavlov can be  
generalized to:  
generally always C,  
if opponent defects then do  
something

maybe do finite game with infinite population

↪ not nice for finite automation etc.

---

an pumping lemma  $\Rightarrow \exists M$  s.t. defects  
 $\in M$  three against itself

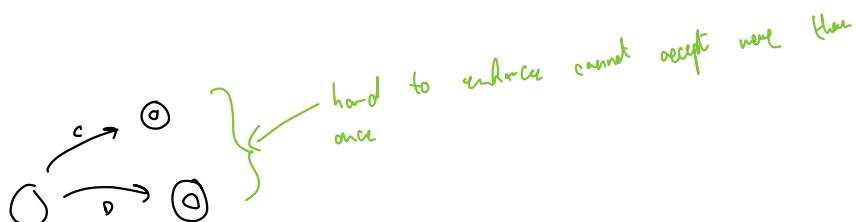
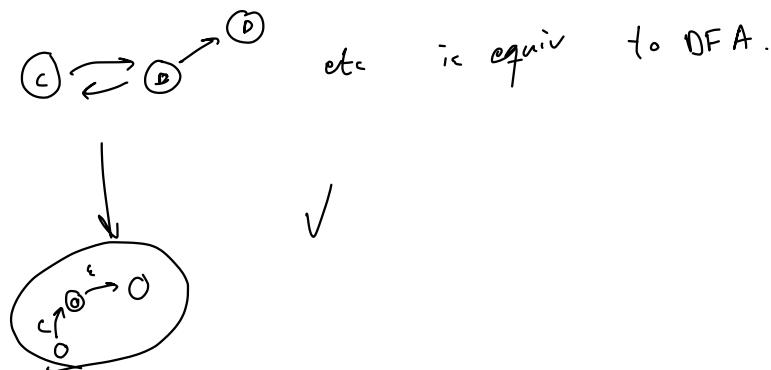
also  $\Rightarrow \exists M$  s.t. after  
turn  $M$  it can defect against  
itself at next turn.

$\Rightarrow \exists M$  s.t. after turn  $M$   
it will never defect against  
itself.

unconvinced  
argument is this  
"eventually repeats itself"  
by

1. my FA idea (15 min)
  2. understanding the proof in the given paper (30 min)
  3. applying the proof to finite games. (30 min)
  4. figure out what to say to Sipser (30 min)
- 

①



OK. so we certainly can convert the natural FA to a normal DFA/NFA and then use pumping lemma.

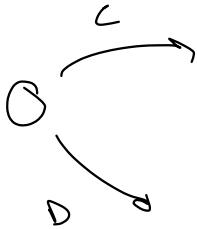
After Sipser: is there another way of converting that natural FA to a normal FA that maybe has equivalence?

(2)

note again: finite automata are the way to go.  
→ equivalent to finite memory Turing machines

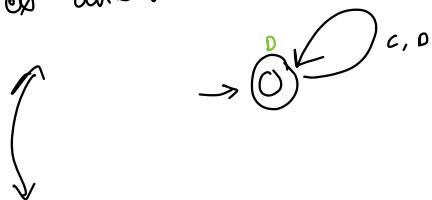
so how do we model noise?

option 1: w/ probability, the finite auto



Ok. so we basically have right the  
probability of following  
transition, and  $1-p$  or following  
wrong one.

ex all D:



oh wait. that's bad.

second option: probability  $p$  of saying the wrong thing.



OK see how to formulate ES.

*could make them same probability*

$$\text{Let } v(s_1, s_2) := \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{i=1}^T E[p(s_1(h_{i,2}), s_2(h_{i,1}))]$$

*move out of the sum.*

$$\text{where } h_{i,2} = h_{i-1,2} \circ s_2(h_{i-1,1})$$

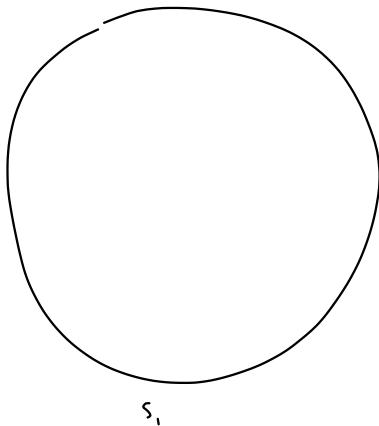
$$h_{i,1} = h_{i-1,1} \circ s_1(h_{i-1,2})$$

and  $p(a,b) = \begin{pmatrix} c & d \\ a & b \end{pmatrix}$

$R_3$	$S_0$
$T_5$	$P_1$

*where*

$T > R > P > S$   
*and*  
 $2P > T + P$



def the fitness  $F(s)$  of strategy  $s$  in a population  $P$  is

$$\sum_{p \in P} f(p) \cdot v(s, p) \quad \text{where } f(p) \text{ is fraction of } p \text{ in } P.$$

def strategy  $s_2$  can invade strategy  $s_1$  if regardless of the distribution in  $P$ ,  $F(s_2) > F(s_1)$ .

( $\hookrightarrow$  thought: "drift" - when  $F(s_2) = F(s_1)$  e.g. All C)

def strategy  $s_1$  is evolutionary stable if it cannot be invaded by any other strategy  $s_2$ .

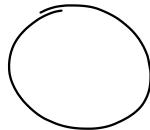
corollary: strategy  $s_1$  is evolutionary stable iff

$$v(s_1, s_1) > v(s_2, s_1)$$

or

$$v(s_1, s_1) = v(s_2, s_1) \text{ and } v(s_1, s_2) \geq v(s_2, s_2)$$

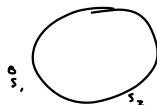
$$v(s_1, s_1) > v(s_2, s_1)$$



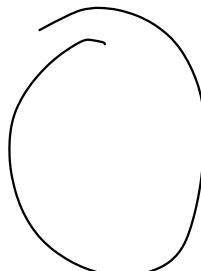
o

well... what happens with  
which somebody is added

$$v(s_1, s_2) > v(s_2, s_2)$$



oh wait. definitely a  
problem with definitions here



.

↑ tiny: can grow

→ is that invariant?  
or: can take over completely?

want so:

$$v(s_1, s_1) < v(s_2, s_1)$$

$$v(s_1, s_2) > v(s_2, s_2)$$

} ← is this possible? yes

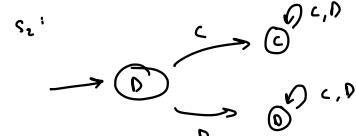
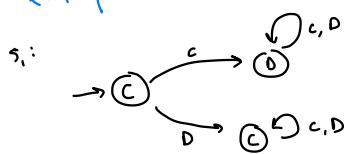


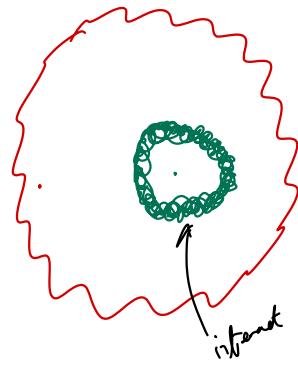
if exists an equilibrium position

oh yeah. is that possible to  
then say they invade each other?  
other?

point 1: if  $s_2$  can reach 70% of population → I do still think that maybe their definition makes more sense

scenario 2: if  $s_2$  can reach 1% of population?





know how does it affect probability.

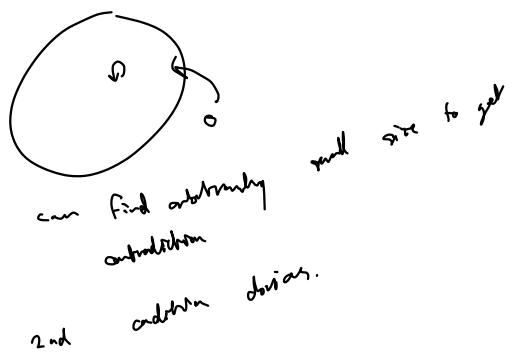


so the problem we are facing is coexistence of multiple strategies in an equilibrium  
→ and that that can happen  
organically.

for now I think will ignore  
this.

how define invasion them?

$$v(s_1, s_1) > v(s_2, s_1)$$



$$\begin{aligned} & \text{ES} \Rightarrow \text{new} \\ & \gamma_{\text{new}} = \gamma_{\text{ES}}. \\ & v(s_1, s_1) \leq v(s_2, s_1) \\ & v(s_1, s_1) < v(s_2, s_1) \\ & \text{can invade} \\ & \text{thus also can invade.} \end{aligned}$$

OK good so I have the  
definitions down.

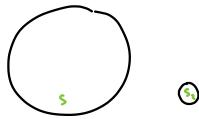
what do I want to prove?

and yet prove this

ok, start with condition 1:

$$H_{S_2}: v(s, s) > v(s_2, s)$$

$$\Leftrightarrow \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T E[p(s(h_{t-1}), s(h_{t-1}))]$$



$$\Rightarrow \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T E[p($$

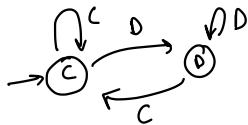
with this definition makes no sense



$$p(s_1, s_2 | h_{t-1})$$

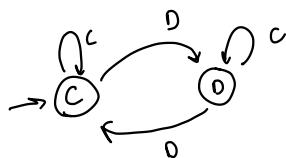
kinda.  
or no no you do.

TFT:



oh wait.  
linearity of expectation  
means first we  
actually can  
do this, and  
break them up  
separable things  
actually.  
interesting.

Pavlov:



interesting, they're very similar.

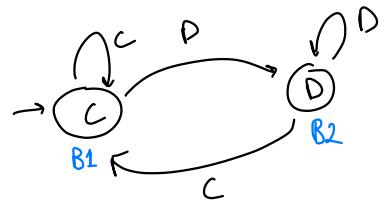
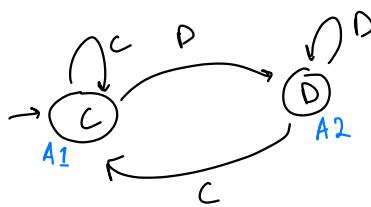
suppose then tft  
nearly

does bad.

1 mistake.

no no no no when  
no more does  
it.

ok start to couple  
 $v(s_{\text{ref}}, s_{\text{ref}})$  because  
 it is at all obvious how  
 one would do so.



$v(s, s) ?$  oh wait I can't  
 compute it without a  
 definition let

at no  
 definition | have the intuition  
 clear:

$$\lim_{T \rightarrow \infty} E[\text{payoff given } T \text{ rounds}]$$

what would we  
 need? we  
 follow  
 through.

aperiodic?

ok what if  
 states and we  
 define

take cross-products  
 parentheses.

$$\left\{ \begin{array}{l} A_1 B_1 \\ A_1 B_2 \\ A_2 B_1 \\ A_2 B_2 \end{array} \right\}$$

regular  
 Markov chain

$$M = \begin{pmatrix} A_1 B_1 & A_1 B_2 & A_2 B_1 & A_2 B_2 \\ (1-p)^2 & (1-p)p & p(1-p) & p^2 \\ A_1 B_2 & p(1-p) & p^2 & (1-p)p \\ A_2 B_1 & (1-p)p & (1-p)^2 & p^2 \\ A_2 B_2 & p^2 & p(1-p) & (1-p)p \end{pmatrix}$$

$\Rightarrow$  markov matrix  
 in  $\pi^n = \pi M$  form

$M : go$  from row  $\rightarrow$  column

human feel feels like a matrix product will do

oh wow. we're interested in the stationary state  
we arrive at starting from  
 $(1, 0, 0, 0)$ .

oh nah. does it necessarily have a  
stationary state?

no eg.

$$\begin{pmatrix} 1 & & & \\ & 1 & & \\ & & 1 & \\ & & & 1 \end{pmatrix}$$

which is periodic.

but if it had a stationary state,  
that is changes to a flat area  
flat that is the time spent in  
each state ??? whhh. oh maybe because  
lazy (you can

$$\pi M = \pi$$

$$\pi(M - I) = 0$$

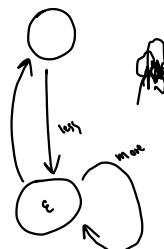
oh no... if we states there's  
no guaranteed unique convergence  
which makes one because you're  
not guaranteed to converge if you  
start in disordered state.

well nearly the only problem  
is periodicity.

ok what was solve TFT  
+ has unique stationary dist

in TFT: will converge to a unique distribution

→ then, can compute the value by multiplying  
with value vector. other?



$$e_1 \rightarrow e_2 \rightarrow e_1$$



ohh. always los then I ending out.

so self loop

en nettoinkomst never escapes!

ok so self loop state has constant  
value  $e_1$ . ah but needs to  
be strongly connected typ  $\tilde{s}$  den zbe  
similar

ah ah makes sense

you do converges even  
doesn't matter if  
now fast to  
converge, but  
most fast  
take strategy  
value and  
multiply  
with probab.  
probabs.

so in TFT case we can just compute steady state vector

beliefs e.g. expectation on old in addition  
however i steady state

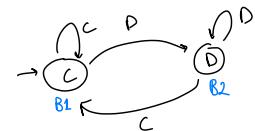
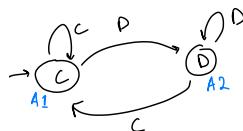
$\rightarrow \bar{j}^*$  for steady state  $\pi^*$   
on prob dist.

regular if some power has positive elements  
then only find addit risk att man station lever  
not necessarily true!

but ok TFT: (has unique stationary state)

$$\pi M = \pi$$

	$A_1B_1$	$A_1B_2$	$A_2B_1$	$A_2B_2$
$A_1B_1$	$(1-p)^2$	$(1-p)p$	$p(1-p)$	$p^2$
$A_1B_2$	$p(1-p)$	$p^2$	$(1-p)^2$	$(1-p)p$
$A_2B_1$	$(1-p)p$	$(1-p)^2$	$p^2$	$p(1-p)$
$A_2B_2$	$p^2$	$p(1-p)$	$(1-p)p$	$(1-p)^2$

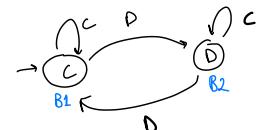
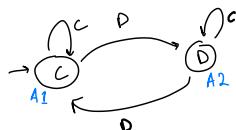


payoff:  $\begin{matrix} A_1B_1 \\ R & S & T & P \end{matrix}$  )  $\begin{pmatrix} 3 & 0 & 5 & 1 \end{pmatrix}$   
 (for A)

stationary vector:  $\begin{pmatrix} .25 & .25 & .25 & .25 \end{pmatrix}$   
 wtf.

parov then:

	$A_1B_1$	$A_1B_2$	$A_2B_1$	$A_2B_2$
$A_1B_1$	$(1-p)^2$	$(1-p)p$	$p(1-p)$	$p^2$
$A_1B_2$	$p^2$	$p(1-p)$	$(1-p)p$	$(1-p)^2$
$A_2B_1$	$p^2$	$p(1-p)$	$(1-p)p$	$(1-p)^2$
$A_2B_2$	$(1-p)^2$	$p(1-p)$	$(1-p)p$	$p^2$



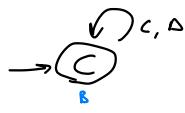
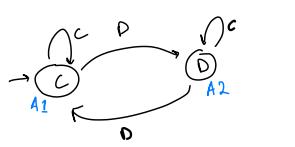
interesting:

stationary:  $(0.448, p(1-p), p(1-p), 0.232)$

$$2p - 2p^2 + k = 1$$

$$1 - 2p + 2p^2$$

$$\begin{array}{c} \text{Parlour} \quad v_1 \quad A1 C \\ \hline s_1 = \text{Parlour}, \quad s_2 = A1 C. \end{array}$$



A1B      A2B

$$A1B \begin{pmatrix} 1-p & p \\ p & 1-p \end{pmatrix} \quad \begin{matrix} (\text{eig: } \left( \frac{1}{2}, \frac{1}{2} \right) \\ (-4p^3 + 7p^2 - 4p + 1, \quad -p^2, \quad -p, \quad 4p^3 - 5p^2 + 2p) \\ (1-4p, \quad 9p, \quad 9p, \quad 24p) ) \end{matrix}$$

$$v(s_1, s_1) = (-4p^3 + 7p^2 - 4p + 1, \quad p(1-p), \quad p(1-p), \quad 4p^3 - 5p^2 + 2p) \cdot (R, S, T, P)$$

$$v(s_1, s_2) = \left( \frac{1}{2}, 0, \frac{1}{2}, 0 \right) \cdot (R, S, T, P)$$

$$v(s_2, s_1) = \left( \frac{1}{2}, \frac{1}{2}, 0, 0 \right) \cdot (R, S, T, P)$$

$$v(s_2, s_2) = (1, 0, 0, 0) \cdot (R, S, T, P)$$

$$v(s_1, s_1) > v(s_2, s_1) \quad \text{as} \quad p \rightarrow 0 \quad \underline{\text{so not invaded.}}$$

yeah never makes a lot of sense.  
thus model overall makes a lot of sense.

Parlour vs all D ? does not affect evolutionary stability.

aha. so we first compare as  $p \rightarrow 0$

then  $\frac{1}{p}( )$  as  $p \rightarrow 0$

then  $\frac{1}{p} \dots$

and so on

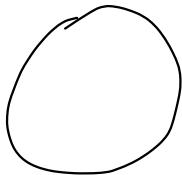
nothing special about being perfect there.

so .... what's my conclusion?  
→ I need to prove off dom strategy.

Suppose  $v(s_1, s_1) < R$

then create  $s_2 \sim s_1$  s.t.  $v(s_2, s_1) = v(s_1, s_2) = v(s_1, s_1)$   
and  $v(s_2, s_2) = R$

necessarily end up in equilibrium?



$s_1: H H H H H H H H \bar{a} \bar{a}$   
 $s_1: \text{wavy line } \bar{b} \bar{b}$   
 $s_2: + H H H H H H H H \bar{a} \bar{a}$   
 $s_2: \text{wavy line}$

$$v(s_1, s_1) = v(s_2, s_1)$$

$$v(s_1, s_2) < v(s_2, s_2)$$

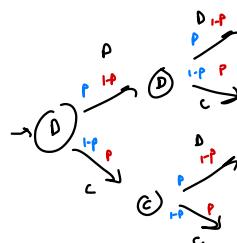
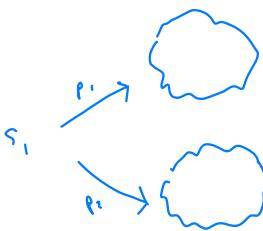
plan.

consider strategy that does ADD +  $\frac{1}{n} C$   
and add  $\frac{1}{n} P$  denominator.  
oh  $\rightarrow$  add  $\frac{1}{n}$  num.

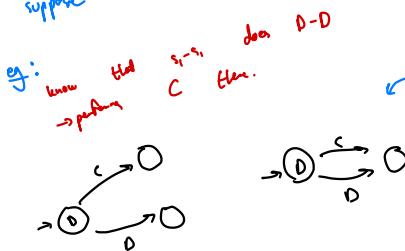
idea is: flip two adjacent states  
eg:

yeah I think we can just do that always without changing final outcome right.

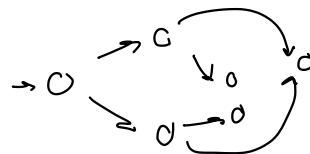
nonono



suppose it tries to do with ~~directly~~: ok. so if we invert both then we good  $\Rightarrow$



always better here! more not necessary



then it works.

ahhhh two models very different.

① perception error:

② action error: we know (it will always)  
how a various possibility  
being anywhere

nonono, not different me stupid.

hmm maybe my  $P \rightarrow S$  thing  
needs to happen first

which

right

what does  $p \rightarrow 0$  mean?

indeed at  
why not define made  
have extinguish?  
i.e. always  
burner.



w/o can't think  
like that.

but what does it mean  
that  $p \rightarrow 0$ .

I think since  $P$   
initially doesn't allow  
for invasion.

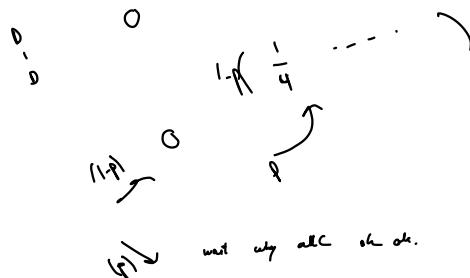
is  $\text{poly}(p) > 0$  ?  
most have root at some  
 $p \in (0, 1)$  then.

probably has though.  
 $p \rightarrow 1-p$  completely reverse  
all behavior (?)

know ok.

if we know constant

probability of D-D for example  
why would that change things?



and why all ok.

so under their idea  
isn't too stupid....

given most likely, self  
identity.

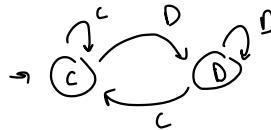
so what is their strategy again?

given history

I actually think it  
will work. The idea  
our result is honestly  
very very similar come  
to think about it.  
the  $p \rightarrow 0$  strategy  
at  $v(s_1, s_1) = R$  is  
precisely just the  
top level. Now ok.  
really try, next time.

OK let's try to invade TFT.

clearly it doesn't matter.  
because whatever the definition is,  
will end up in same state



ok so take  $p \rightarrow 0$

doesn't help I think

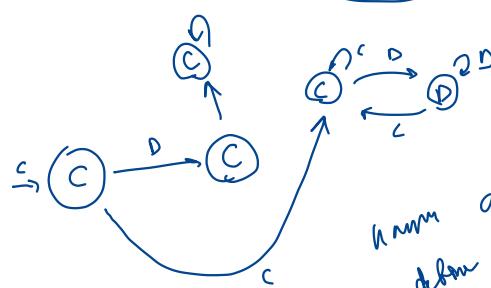
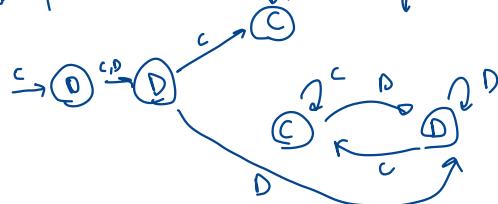
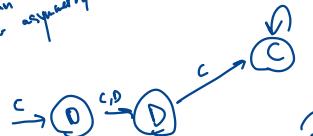
for TFT this works.

so ok. given history that  
minimizes future gain.

then doing  
will never  
maybe not



ok since can  
be after everything



CC
DC

now the only happens then.  
suppose that

is normal ok  
in defn it makes new  
unit given we can  
design our strategy

oh interesting

WE CAN DESIGN A STRAT

GIVEN THE FRACTION OF

INVASION, SO THE STRAT

WILL CHANGE WITH THE

PROPORTION BUT I THINK

THAT IS FINE

hmm this is weird

but this definition makes a lot  
more sense, and also makes this possible  
to prove.

also: strength evolutionary stability - so  
it seems reasonable

oh, I guess the good thing  
with pre-infected  $\Rightarrow$  that it is actually

so, define invasion in terms  
of parameter  $\alpha$ .

attaching some  
level

OK or we probably could change our definitions with that.

but can we do something actually interesting?

OK I like the idea of infinite repetition. Like you need to prove yourself infinitely many times.

problem:  $(1-p)^\infty = p^\infty$

Waaaaaaah... can we construct.  
 $\lim_{n \rightarrow \infty} f((1-p)^n) = 1$        $\lim_{n \rightarrow \infty} f(p^n) = 0$  ?

(as  $f(1) \neq 1-p$ )

ok so step function is good  
 but hard to construct.

$$1-p + (1-p)^2 + \dots =$$

$$= \frac{x^{n+1}-1}{x-1} = \frac{1}{1-(1-p)} = \frac{1}{p}$$

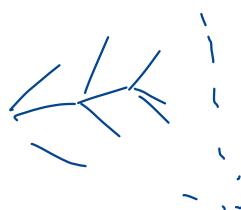
$p^\infty = 0$        $(p+\frac{1}{2})^\infty = 0$

ok so construct  $\frac{1}{2}$ .

probably possible

strategi:

dela upp i branches:



$\rightarrow$  skapa  $\frac{1}{2}$  i en av dem,

$p$  i en av dem

$\rightarrow$  kombinera dem

$\rightarrow$  oka shit.

ok sig att vi kan skapa

$$p(p+\frac{1}{2})$$

hur kan vi använda det?

$$\rightarrow$$
 kom ihåg  $p^\infty (p+\frac{1}{2})^\infty$

ok I think what I'm doing makes no sense.

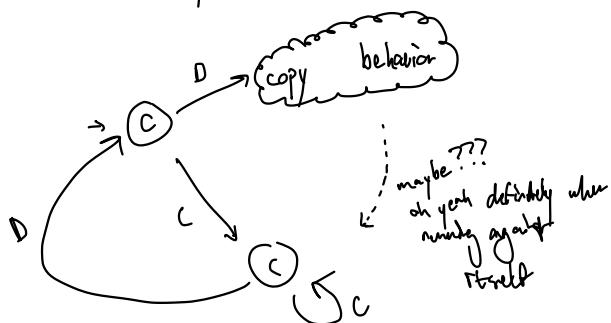
ok so the problem is  
that "strategy" could possibly  
affect the other

(assuming here we only have  
Markov CC but can easily extend)

we just need to make sure  
that doesn't happen to us.

oh ok very simple I think:

sure, I may do that is  
to just copy. but there  
has to be other ways.



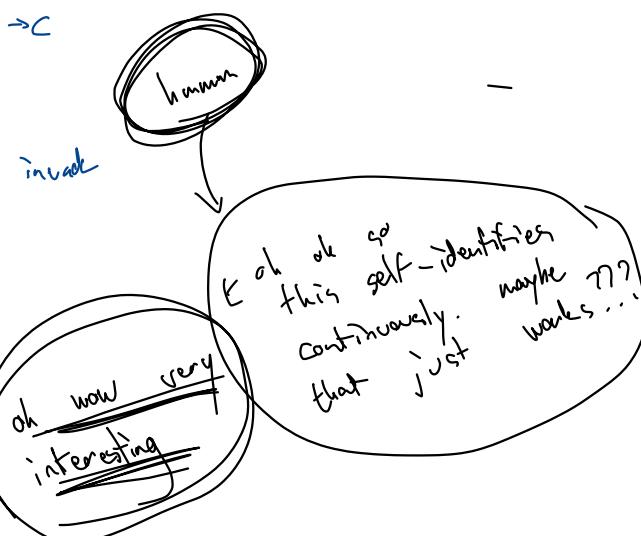
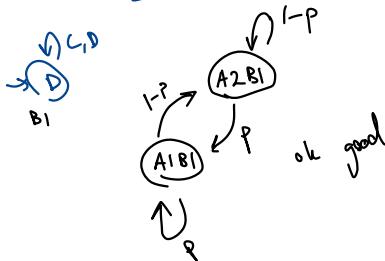
when bad: D

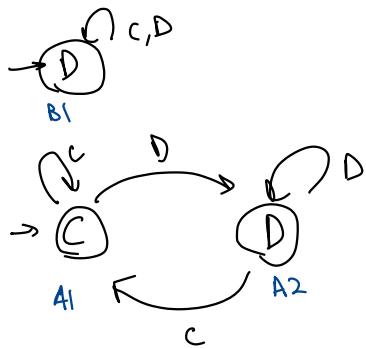
oh ok so when change  $D \rightarrow C$   
potentially bad

wait.... can Pavlov actually invoke  
all D?



at no. but TFT?





ok so alt son in steady state: D.  
~~I, ok if all D can not be invaded~~

ok

A1 B1	A2 B1
A1 B1	P      1-P
A2 B1	P      1-P

fuck.

vector is  $(p, 1-p)$ , so we get that TFT loses

darn.

damn du same thing again: for sufficiently small  $p$ , can invade.

oh ok so we have a bigger problem at hand:

All D can now not be invaded.

Possible ways to fix this:

- ① make  $p \rightarrow 0$  earlier  
i.e. instead of fixing  $p$  and  
then letting  $\alpha \rightarrow 0$ ,  
fix  $\alpha$  and let  $p \rightarrow 0$ .

- ② define invasion differently:

a strategy is ES iff given  
a populat

Try ①

invade if:

$$F(s_2) > F(s_1) . \quad \text{Let } f(s_2) = \alpha$$

typically  $\alpha \ll 1$ .

$$s_1 = A \amalg D$$

that is:

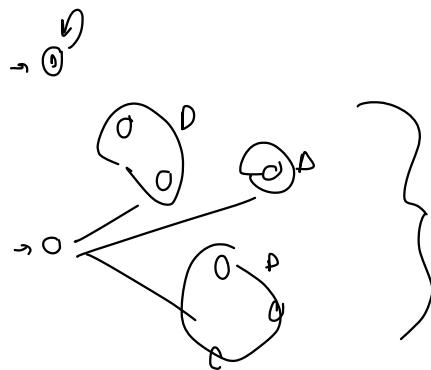
$$f(s_1) v(s_2, s_1) + f(s_2) v(s_2, s_2) > f(s_1) v(s_1, s_1) + f(s_2) v(s_1, s_2)$$

then:

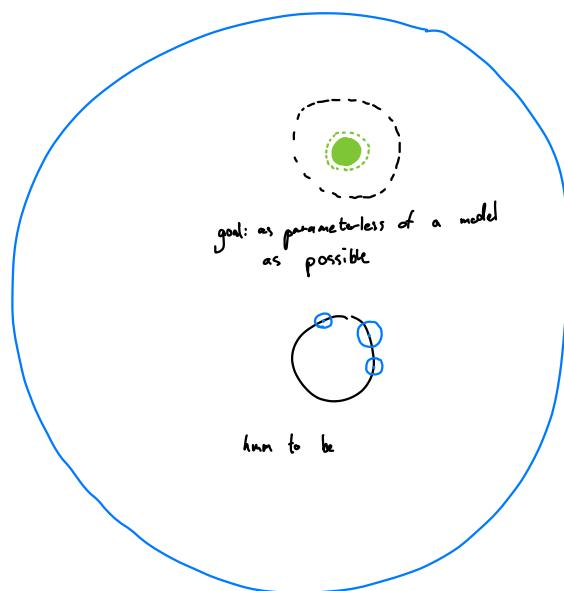
$$(1-\alpha) v(s_2, s_1) + \alpha \cdot v(s_2, s_2) > (1-\alpha) v(s_1, s_1) + \alpha \cdot v(s_1, s_2)$$
$$\uparrow \quad \uparrow \quad \uparrow \quad \uparrow$$
$$D - p^k \cdot \square \quad \text{big} \quad D \quad D + p^k \cdot \square$$

just approach this naturally.

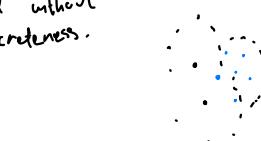
then evolutionary stable would mean something like:  
even in infinite populations, can't be invaded



then it cannot collide with anyone.



again this seems  
hard without  
discreteness.



oh ok so this model  
suggests that it is  
reasonable to define invasion  
as starting from some  
fraction  $\epsilon$  and then that  
fraction will only increase

inlude  $f$ :  
 $F(s_2) > F(s_1)$ . Let  $f(s_2) = \alpha$

$$s_i = A \setminus D$$

that is:

$$f(s_1) v(s_2, s_1) + f(s_2) v(s_2, s_2) > f(s_1) v(s_1, s_1) + f(s_2) v(s_1, s_2)$$

then:

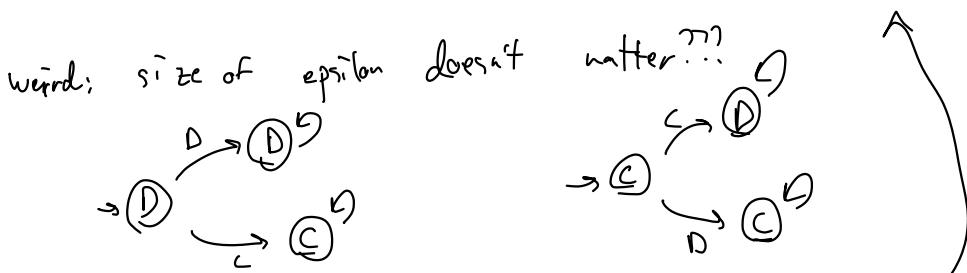
$$(1-\alpha) v(s_2, s_1) + \alpha \cdot v(s_2, s_2) > (1-\alpha) v(s_1, s_1) + \alpha \cdot v(s_1, s_2)$$

this  $\uparrow$  is true, and we know that

$\alpha + \epsilon$  then:

$$-\epsilon \cdot v(s_2, s_1) + \epsilon \cdot v(s_2, s_2) \stackrel{?}{\geq} -\epsilon \cdot v(s_1, s_1) + \epsilon \cdot v(s_1, s_2)$$

$$v(s_1, s_1) + v(s_2, s_2) \stackrel{?}{\geq} v(s_2, s_1) + v(s_1, s_2)$$



oh so this is not always true!

oh! but we get to choose  $s_2$ !!!!.

so can we make sure that this doesn't happen?

oh only get to pick  $s_2$  for disproving ESS,  
not proving it no

$$(1-\alpha)v(s_2, s_1) + \alpha \cdot v(s_2, s_2) > (1-\alpha)v(s_1, s_1) + \alpha \cdot v(s_1, s_2)$$

given  $\alpha$ , find  $s_2$ . can easily prove that that is possible!

does this mean..... that we're done?

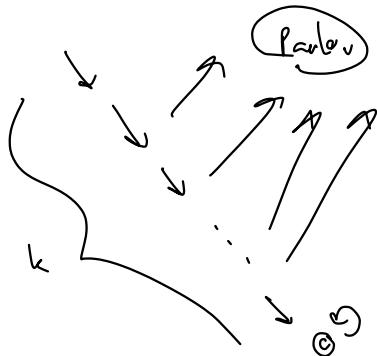
ahhhhhh  
I think Pavlov is invadable now 

yes ii. So... we need to strike a balance.....  
wait ok I'm not convinced anymore.



$$v(s_2, s_1) = (1-p^k)v(s_1, s_1) + p^k \cdot S$$

$$v(s_2, s_2) = p^{2k} \cdot R + (2p^k - 2p^{2k}) \cdot \frac{(S+T)}{2}$$



$$+ (1-p^{2k})^2 \cdot v(s_1, s_1)$$

$$v(s_1, s_2) = (1-p^k)v(s_1, s_1) + p^k \cdot T$$

$$(1-\alpha)v(s_2, s_1) + \alpha \cdot v(s_2, s_2) > (1-\alpha)v(s_1, s_1) + \alpha \cdot v(s_1, s_2)$$

$$v(s_2, s_1) = (1-p^k)v(s_1, s_1) + p^k \cdot S$$

FAKE NEWS.

$$v(s_2, s_2) = p^{2k} \cdot R + \frac{(2p^k - 2p^{2k}) \cdot (S+T)}{2}$$

$$+ (1-p^k)^2 \cdot v(s_1, s_1)$$

$$r := v(s_1, s_1)$$

$$v(s_1, s_2) = (1-p^k)v(s_1, s_1) + p^k \cdot T$$

$$-(1-\alpha)p^k r + (1-\alpha)p^k S + \alpha p^{2k} R + \alpha(p^k - p^{2k})(S+T) + \alpha(1-p^k)^2 r - \alpha(1-p^k)r - \alpha p^k T \stackrel{?}{\geq} 0$$

$$r(-p^k + \cancel{\alpha p^k} + \cancel{\alpha} - 2\cancel{\alpha p^k} + \alpha p^{2k} - \cancel{\alpha} + \cancel{\alpha p^k})$$

$$\downarrow$$

$$r(\alpha p^{2k} - p^k) + S(p^k - \cancel{\alpha p^k} + \cancel{\alpha p^k} - \cancel{\alpha p^{2k}})$$

↓

$$S(p^k - \cancel{\alpha p^{2k}})$$

$$+ T(\alpha p^k - \cancel{\alpha p^{2k}} - \cancel{\alpha p^k})$$

↓

$$T(-\cancel{\alpha p^{2k}})$$

$$+ \cancel{\alpha p^{2k}} R$$

?

$$r(\alpha p^{2k} - p^k) + S(p^k - \cancel{\alpha p^{2k}}) - T \cancel{\alpha p^{2k}} + \cancel{\alpha p^{2k}} R \stackrel{?}{\geq} 0$$

$$r(\alpha p^k - 1) + S(1 - \cancel{\alpha p^k}) - T \cancel{\alpha p^k} + \cancel{\alpha p^k} R \stackrel{?}{\geq} 0$$

wow ok NOT  
obvious at all

$$\gamma(\alpha p^k - 1) + s(1 - \alpha p^k) - T\alpha p^k + \alpha p^k R \stackrel{?}{>} 0$$

$$\gamma \alpha p^k + s + \alpha p^k R \stackrel{?}{>} \gamma + s \alpha p^k + T \alpha p^k$$

omg wow. as  $p \rightarrow 0$  this is NEVER true.

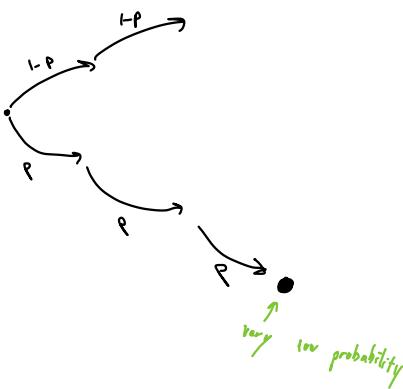
lolol I played myself i've been false never this entire time lolol

$$T > R > P > S$$

how i made AND here ?  $(1-\alpha)v(s_2, s_1) + \alpha \cdot v(s_2, s_2) > (1-\alpha)v(s_1, s_1) + \alpha \cdot v(s_1, s_2)$

$\forall \alpha (\text{small})$ , find  $s_2$  such that  $\uparrow$  is true

$$v(s_1, s_2) = P$$



$$(1-\alpha) \nu(s_2, s_1) + \alpha \cdot \nu(s_1, s_2) > (1-\rho) \nu(s_1, s_1) + \alpha \cdot \nu(s_1, s_2)$$

$\rho^2 > \rho(1-\rho), (1-\rho)^2$   
 or so I do this.  
 you like this.

$$\nu(s_2, s_1) = (1-\rho^k) \gamma + \rho^k \cdot S$$

$$\nu(s_2, s_2) = (1-\rho)^{2k} \cdot R + 2 \cdot (1-\rho)^k \cdot (1-(1-\rho)^k) \left(\frac{S+T}{2}\right) + (1-(1-\rho)^k)^2 \cdot \gamma$$

$$\nu(s_1, s_2) = (1-\rho^k) \gamma + \rho^k \cdot T$$

$$(1-\alpha)(-\rho^k) \gamma + (1-\alpha)\rho^k S + \alpha(1-\rho)^{2k} R + \alpha(1-\rho)^k \cdot (1-(1-\rho)^k)(S+T) + \alpha(1-(1-\rho)^k)^2 \gamma$$

$$- \alpha(1-\rho^k) \gamma - \alpha \rho^k \cdot T \stackrel{?}{>} 0$$

$$\gamma \left( -\rho^k + \alpha \rho^k + \cancel{\alpha - 2\alpha(1-\rho)^k + \alpha(1-\rho)^{2k}} - \cancel{\alpha + \alpha \rho^k} \right)$$

$\gamma = R - P$

$$+ S \left( \rho^k - \alpha \rho^k + \alpha(1-\rho)^k - \alpha(1-\rho)^{2k} \right)$$

$$+ R \left( \alpha(1-\rho)^{2k} \right)$$

$$+ T \left( \alpha(1-\rho)^k - \alpha(1-\rho)^{2k} - \alpha \rho^k \right)$$

$$(R+\gamma)(1-\rho)^{2k} \stackrel{?}{>} (\gamma+\gamma)(1-\rho)^k$$

$$(R-2\beta) \left( (1-\rho)^{2k} - (1-\rho)^k \right) + \beta(1-\rho)^{2k} \stackrel{?}{>} 0$$

$$a(q^2 - q) + bq^2 \stackrel{?}{>} 0$$

oh so seems like increasing  $k$   
is just... bad?

safely set  $\alpha$  sufficiently small so  $L$

I feel like this is fake news!

ohhhh the  $\frac{S+T}{2}$  bound always holds which makes sense ( $\frac{S+T}{2}$  is symmetric for large & small  $P$ ).  
for small  $P$  we get the  $R$  bound.

$$\gamma \left( -p^k + \alpha p^k + \cancel{\alpha - 2\alpha(1-p)^k + \alpha(1-p)^{2k} - \cancel{\alpha + \alpha p^k}} \right) + R \left( \alpha(1-p)^{2k} \right)$$

$$\gamma \left( -p^k + \alpha p^k - 2\alpha(1-p)^k + \alpha(1-p)^{2k} + \alpha p^k \right) + R \alpha(1-p)^{2k} \stackrel{0}{\rightarrow} 0.$$

$$\gamma \left( 2\alpha p^k + \alpha(1-p)^{2k} \right) + R \alpha(1-p)^{2k} \stackrel{0}{\rightarrow} \gamma \left( p^k + 2\alpha(1-p)^k \right)$$

$$\gamma 2\alpha p^k + \alpha(1-p)^{2k} (\gamma + R) \stackrel{0}{\rightarrow} \gamma p^k + \alpha(1-p)^k (\gamma + \gamma)$$

$$\gamma p^k (2\alpha - 1) + \alpha(1-p)^k \left( (1-p)^k (\gamma + R) - 2\gamma \right) \stackrel{0}{\rightarrow} 0$$

$R = \gamma + f(p)$  then.

$$\gamma p^k (2\alpha - 1) + \alpha(1-p)^k \left( 2\gamma(1-p)^k - 1 + f(p)(1-p)^k \right) \stackrel{0}{\rightarrow} 0$$

$$1-p = q$$

$$2\gamma (q^k - 1) + f(q) q^k \stackrel{0}{\rightarrow} 0$$

Suppose then  $f(p) = c \cdot p$   
 $f(q) = c(1-q) = c - cq$   
 $2\gamma q^k + cq^k \stackrel{0}{\rightarrow}$   
 $\stackrel{0}{\rightarrow} 2\gamma + cq^{k+1}$

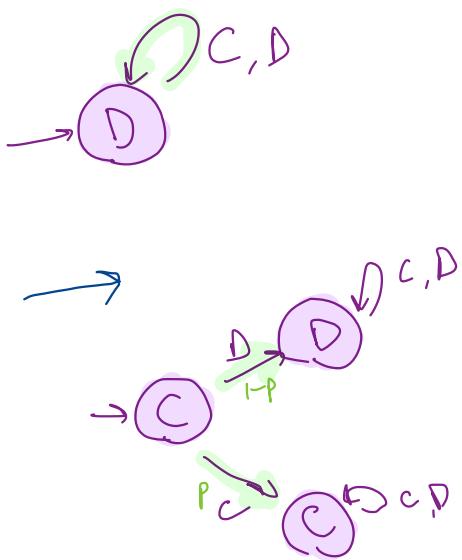
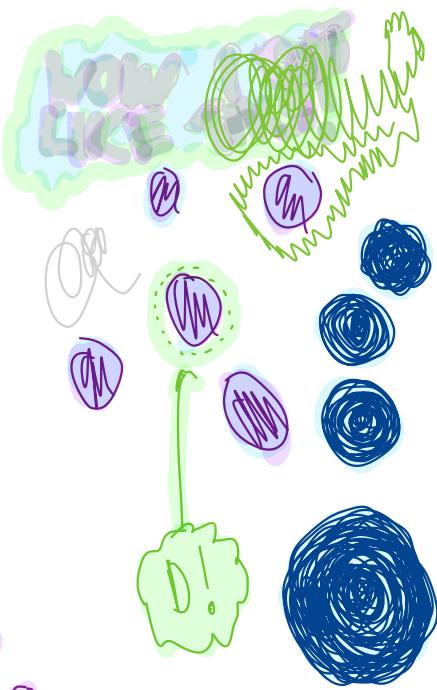
$$q^k (2\gamma + f(q)) \stackrel{0}{\rightarrow} 2\gamma$$

limits k by above

$$f(q) \stackrel{0}{\rightarrow} \frac{2\gamma}{q^k} - 2\gamma$$

hummm definitely not doing

hummm this is not really satisfying.  
I would want it to hold for any  
 $p < 0.5$  really.



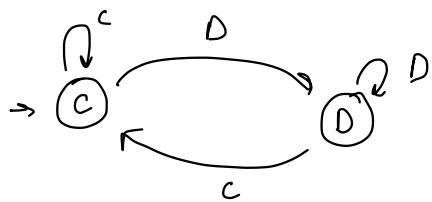
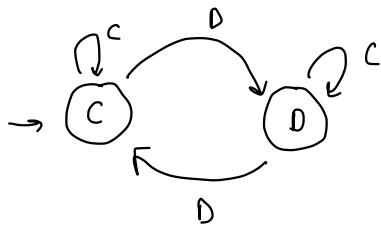
$$s_1 - s_1 : P$$

$$s_1 - s_2 : (1-p) \cdot P + p \cdot T$$

$$s_2 - s_1 : (1-p) \cdot P + p \cdot S$$

$$s_2 - s_2 : (1-p)^2 \cdot R + p(1-p)S + p(1-p)T + p^2 \cdot P$$

more abstractly:  
we have  
given a polynomial of  
properties  $\theta$   
what is  
only one  
parameter.



leaves out:

\* might want to have ~~prolific~~ ~~proliffrific~~ players.

fantasy level: (nearly randomly)

↳ more shades can kill all  
small shade machine.

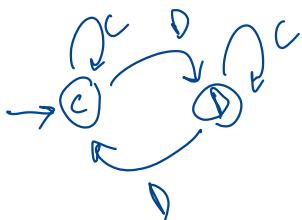
evolutionary: advantage to having  
more homoplasies

more states can always kill your strategy?

→ go back to deterministic model

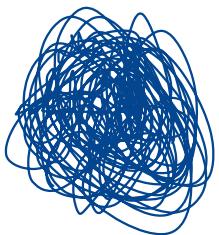
→ look at language?

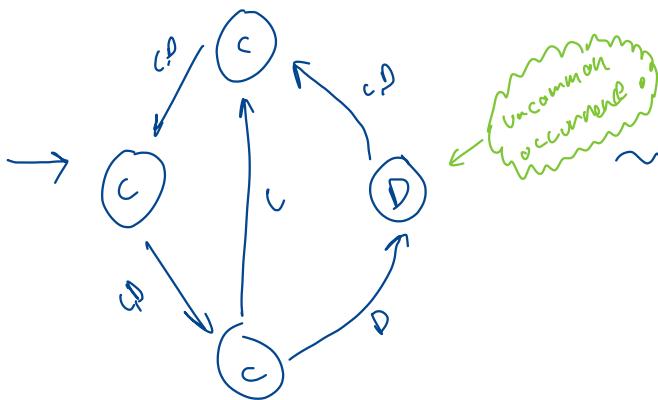
→ still look at infinite case?  
(will have to look at loops)



for can create multiple branches at a single step  
that depends on these are!

look at machines with states?  
 $\Theta(n)$ ,  $\Theta(n^2)$  etc  
other parameter is game length!





actually  
addh, not I know  
what my problem is...  
Pavlov needs to be ESS-  
and for fix Pavlov  
doesn't make sense.

# VERDICT

the definition  
use makes sense!

because for a given f  
might be better than  
Pavlov (eg long loop)

go to work be able  
at all state the result  
with a

oh, could say that

$$S_1 \text{ is ES} \Rightarrow \\ \Rightarrow V_{S_1}(S_1) = R - \sigma(p)$$

random thought?

can we say that we  
need  $\delta \geq R - p$   
or something like that?

$$\gamma = R - f(p) \text{ then.}$$

$$\gamma p^k (2\alpha - 1) + \alpha (1-p)^k \left( 2\gamma ((1-p)^k - 1) + f(p)(1-p)^k \right) \geq 0$$

$$2R((1-p)^k - 1) + 2f(p) - f(p)(1-p)^k \geq 0$$

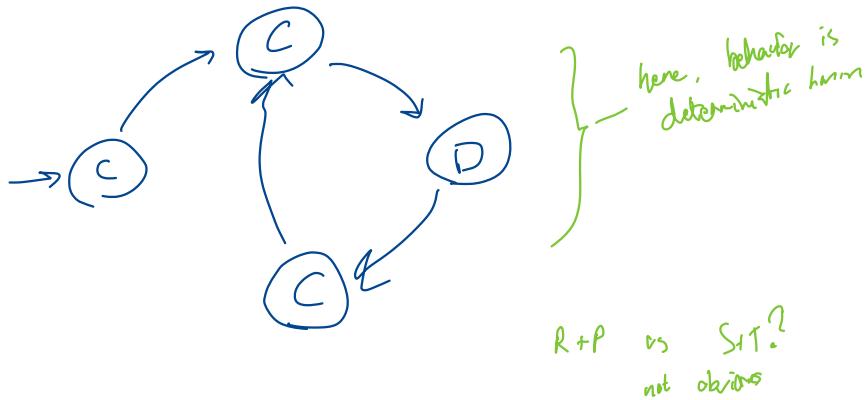
$$f(p) > \frac{2R(1 - (1-p)^k)}{2 - (1-p)^k}$$

$$k=1 \Rightarrow f(p) > \frac{2R \cdot p}{1+p}$$

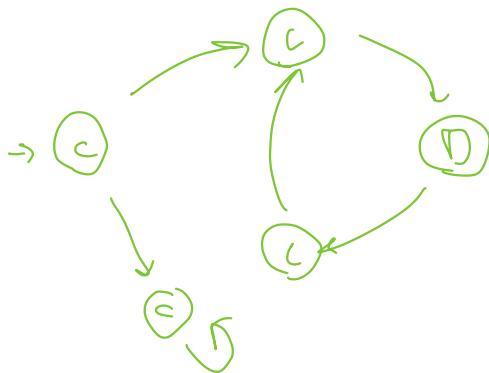
$$\text{So: must have } \geq R - \frac{2Rp}{1+p} =$$

$$= \frac{R - Rp}{1+p} = \\ = R \left( \frac{1-p}{1+p} \right)$$

$$P = 0.25 \\ \text{then: } \geq 0.6R \\ \text{so } \cancel{\frac{2}{3}c} \text{ is good}$$



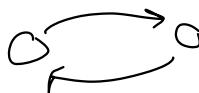
$R+P$  vs SIT?  
not obvious



last  $n$  moves  
ergodic  
non- $\emptyset$   
occurring prob of  
markov chain  
only

OK, do we need to restrict  
to ergodic Markov chains here??

oh ok. if eigenvalue 1 then  
has stationary distribution.



but ok. what can happen, really?

we take  $v p^n$  as  $n \rightarrow \infty$

in which cases we

obviously it goes to some  
value right. because it is

we do not need ergodicity  
— we only need non-periodicity

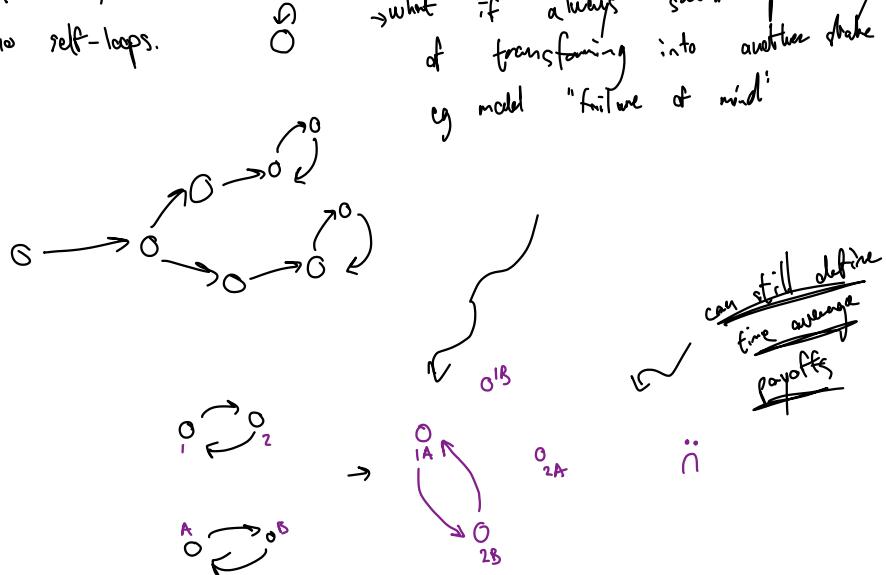
buzzword

oh might also just  
alternate. but mhhhhh  
that's quite obviously fine

what is periodicity?

↪ no self-loops.

OK so this model doesn't really make sense.



problem: noise does nothing  
to transitions that take  
C & D to same place.



ok so it completes the analysis but it should be fine.

OK Markov chain stationary state. and we're taking the limit of it. now.

suppose you're in a chain

$$p_1 \rightarrow p_2 \rightarrow \dots \rightarrow p_n \rightarrow p_1$$

claim:  $\underbrace{p_1 + \dots + p_n}_n$  is stationary.

proof: obvious

only now need to prove that we reach a cycle.

proof: at some point will get arbitrarily close to a previous point.  
(can make  $\epsilon$ -style boxes, use pigeonhole principle)

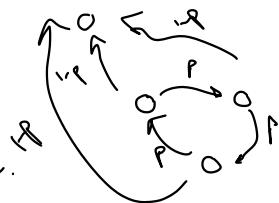
I want to say that it's

a polynomial of  $p$ .

certainly a polynomial at  
every step

$$\text{but} \dots (p^1 + \dots + 1) \rightarrow \frac{1}{1-p}$$

not polynomial in



$v_{s_i}(s_i) \sim \text{coefficient, stationary distribution.}$   
however not obvious to me.

also note that  $\sum$  or  
is always 1.  $\therefore$

like how can i know  
that the limit makes  
sense at all

however we never divide by things.

$$\frac{1}{p} - \frac{1}{p}$$

for example!

$$\begin{pmatrix} a_1 & a_2 \\ a_3 & a_4 \end{pmatrix} \begin{matrix} x_1 \\ x_2 \end{matrix} = \begin{matrix} x_1 \\ x_2 \end{matrix}$$

$A v = v$  eg: oh known

$$\begin{pmatrix} p^{10} & 0 \\ 0 & p^{10} \end{pmatrix} \begin{matrix} x_1 \\ x_2 \end{matrix} = \begin{matrix} x_1 \\ x_2 \end{matrix}$$

} evaluating the stationary dist

oh ok.  
is solution to:

$\pi P = \pi$ .  
all such solutions necessarily  
polynomials?

what is eigenvector?

$$Ax = \lambda x. \quad \text{also need } \sum x = 1.$$

$$(A - I)x = 0$$

x is null vector. polynomial?

ok will be some poly nomial in p

not obvious

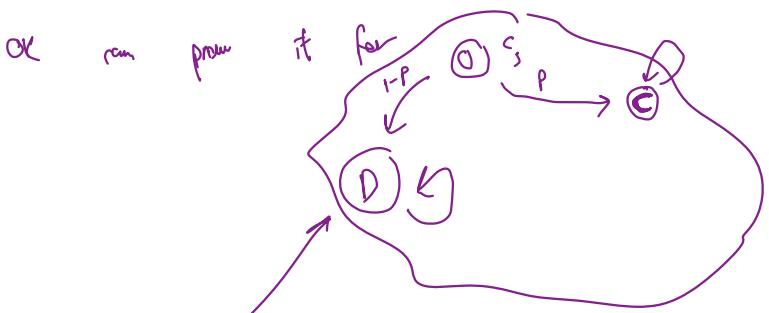
$$\begin{pmatrix} p & p^2 \\ 1 & p \end{pmatrix} x = 0$$

$$x = \begin{pmatrix} p \\ -1 \end{pmatrix} \quad x = \begin{pmatrix} 1 \\ -\frac{1}{p} \end{pmatrix}$$

is it polynomial? ahhh.

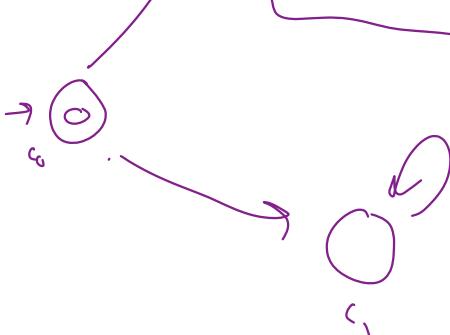
$$1 + p + p^2 + \dots + p^n \quad ??$$

$$v_s(s) = R f s$$



Markov distributions  
are linear.  
so we get  $\frac{r-p \cdot \text{smith}}{1-p}$

$r-p \cdot \text{smith}$

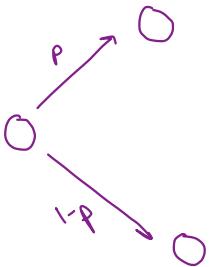


ah fuck.  
not obvious at all  
false, even

$$F(s_2) - F(s_1) =$$

=

ok. so we don't really need  
Markov chain at all here again



$$\text{pick } \varepsilon = \frac{\alpha}{2}.$$

$$R - 2\epsilon p + \epsilon^2 R - 1 \quad \text{if } (1-\epsilon)p(S+T) <$$

$$\begin{aligned} &= (1-\varepsilon) \left( (1-\rho) \gamma + \rho S \right) + \varepsilon \cdot \left( (1-\rho) R + 2(1-\rho)p \cdot \left( \frac{S+T}{2} \right) + \rho^2 \gamma \right) - (1-\varepsilon) \cdot \gamma - \varepsilon \left( (1-\rho) \gamma + \rho T \right) \\ &= \cancel{\rho} - \cancel{\gamma} + \cancel{p} S - \cancel{\gamma} + \cancel{\rho} \gamma + \cancel{\rho} S + \cancel{\varepsilon} R - 2 \cancel{\rho} \epsilon R + \cancel{\epsilon^2 R} + \cancel{\epsilon^2 \gamma} - \cancel{\rho^2 S} - \cancel{\varepsilon p^2 S} - \cancel{\varepsilon p^2 T} + \cancel{\varepsilon p^2 \gamma} - \cancel{\varepsilon \gamma} + \cancel{\varepsilon p \gamma} - \cancel{\varepsilon p T} \end{aligned}$$

$$= -\delta P + S + \delta P + \epsilon P + \epsilon R + \epsilon^2 R + \epsilon^2 \gamma + \epsilon P \gamma - \epsilon P T + \epsilon^2 \gamma - \epsilon \gamma + \epsilon P \gamma$$

$$= \left( \delta P + 2 \epsilon P + \epsilon P^2 + \epsilon P^2 T + \epsilon^2 \gamma \right) - \left( \delta P + \epsilon P + \epsilon P^2 + \epsilon P^2 T + \epsilon^2 \gamma \right)$$

$$= \varepsilon (R - \gamma) + P (S + \epsilon \gamma + \epsilon P + \epsilon P^2 + \epsilon P^2 T + \epsilon^2 \gamma - \gamma + 2 \epsilon R + \epsilon P T)$$

OK, how else define  $v_{s_i}(s_2)$  ?

$$\sum \pi_{c_1, c_2} \cdot r(c_1, c_2)$$

define as

$$v_0 M^\infty ?$$

$$\text{or } r(v) = \sum v_{c_1, c_2} \cdot r(G_{s_1}(c_1), G_{s_2}(c_2))$$

then look at

expected value  
of time average

which.

could also define as

$$\lim_{T \rightarrow \infty} \frac{1}{T} \sum r(a_i, b_i)$$

$$E \left[ \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{i=1}^T r(v_i) \right]$$

what do I need for  $v_{s_i}(s_i)$ ?

if continuous?

①  $\lim_{p \rightarrow G} v_{s_i}(s_i)$  exists

②  $v_{s_i}(s) \leq R$

③ easy to calculate splits.

c2.

could invent notion  $E[R | X_i = \text{smth}]$   
to get properties like

$$E[R] = E[R | X_i = z] + E[R | X_i = \bar{z}]$$

oh nice nice.



nice. oh wait not  
a series

$$X_n = \frac{1}{n} \sum_{i=1}^n v(X_i)$$

$$E\left[\lim_{n \rightarrow \infty} X_n\right] = \lim_{n \rightarrow \infty} E[X_n]$$

The limit definition makes the most sense, clearly.

$$\lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T E[r(\dots)]$$

So. Let  $X_n = r.v.$  for which state  
at time step  $n$ .

then, reward is

$$V_{S_1}(S_2) = E \left[ \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T r(X_t)_1, (X_t)_2 \right] \quad | X_0$$

$$\lim_{T \rightarrow \infty} E \left[ \frac{1}{T} \sum_{t=1}^T r(\dots) \right]$$

always  
on always  
on something  
of something  
else



{ easy to interpret. the expected reward  
when playing infinitely long.

same as looking at stationary state?

ah yes, if goes to

stationary

if can exchange  
limits then yes.

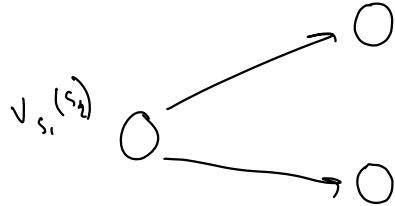
{ but not

~~using Finito's theorem~~

dominated

convergence

theorem



can rewrite as  
weighted average of every state  
value of every state  
then  $E[\text{fraction of time in state } i | X_0 = \dots]$   
value for time

$$v_{s_1}(s_2) = \dots | X_0 = (c_{\text{start}}(s_1), c_{\text{start}}(s_2))$$

$$v_{s_1}(s_2) = E \left[ \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=0}^T r(X_t) \mid X_0 = (c_{\text{start}}(s_1), c_{\text{start}}(s_2)) \right]$$

↑ ordinary limit!!!

ah. the theorem becomes very easy to prove now  
just condition on different events and stuff.

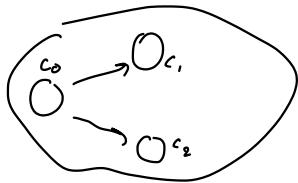
this definition doesn't make sense to me  
or kinda, generate infinite sequence, apply this function

ohhhhhh. I think that makes sense now.

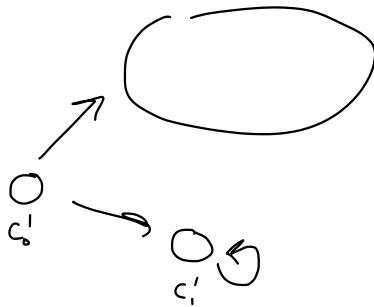
$$\lim_{T \rightarrow \infty} E \left[ \frac{1}{T} \sum_{t=0}^T r(X_t) \mid X_0 = \dots \right]$$

very obviously the same

→ much harder to argue existence.



$s_1$



$$v_{s_1}(s_1) = E\left[\dots \mid X_1 = (c_1, c_1)\right] \cdot P(X_1 = (c_1, c_1)) \\ + \dots$$

okok this works; nice.

$$\lim_{p \rightarrow 0} v_{s_1}(s_2) \quad \text{exists?}$$

$$\lim_{p \rightarrow 0} E\left[ \underbrace{\lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T r(X_t)}_{\text{does this limit exist?}} \mid X_0 = (c_{\text{stat}}(s_1), c_{\text{stat}}(s_2)) \right]$$

↑  
does this limit exist ?? uhhh not really

$$\forall \varepsilon > 0 \quad \exists N : |x_n - \bar{x}| < \varepsilon \quad \forall n \geq N$$

$$\lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=1}^T E[r(X_t)]$$

hmmmm seems blue  
I don't wanna think  
about convergence

$$\lim_{\rho \rightarrow 0} V_{s_1}(s_2)$$

$$V_{s_1}(s_2) = \mathbb{E} \left[ \left. \lim_{T \rightarrow \infty} \frac{1}{T} \sum_{t=0}^T r(x_t) \right| X_0 = (c_{\text{start}}(s_1), c_{\text{start}}(s_2)) \right]$$

↑ ordinary limit !!!

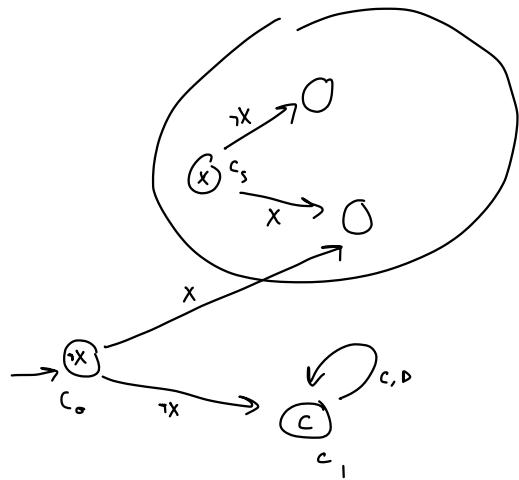
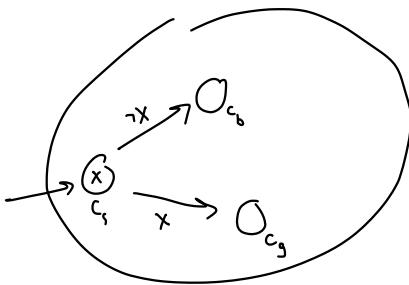
reward

$E[\text{fraction of time in state } i \mid X_0 = \dots]$

↳ defines time-average distribution

↑ definitely an eigenvector

$$\pi_{c_1, c_2}$$



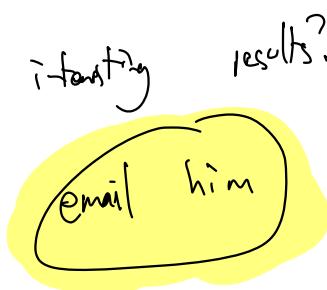
$$\pi^{(c_s, c_{\bar{s}})} = (1-p)^2 \pi^{(c_j, c_{\bar{j}})} + \dots$$

structure?  
→ intro ← why this specific.  
→ setup  
→ results  
→ proofs  
→ discussion of model  
→ non-central but still interesting results?  
→ appendix?

first state, then prove,  
or integrate  
definitions with  
descriptions.

definition of payoffs?

→ which is easier to understand



how to ~~also~~ avoid notation problems?

→ key idea is simple.

if no super  
scripts,  
assume states

before definition 4,

outcome  $\omega$  = pair  
is composed

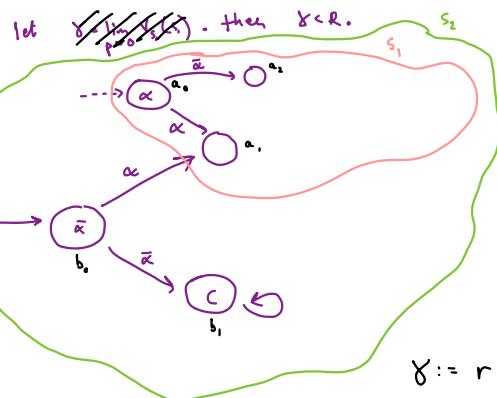
give names

pull  $\uparrow$  out parts

and explaining them first.

use green

Suppose that  $\lim_{n \rightarrow \infty} v_{s_1}(s_i) = R$ !



~~for now, always pick an appropriate r.~~

for now, always pick an appropriate r. then

$r\pi(a_0, a_1)$  is important

$$v_{s_1}(s_i) = r\pi(a_0, a_0) = (1-p)^2 r\pi(a_1, a_1) + 2p(1-p)r\pi(a_2, a_1) + p^2 r\pi(a_2, a_2)$$

$$\leq (1-p)^2 r\pi(a_1, a_1) +$$

$$\leq (1-p)^2 \gamma - 2p(1-p)R + p^2 R.$$

ok cool.

$$v_{s_1}(s_2) = r\pi(a_0, b_0) = (1-p)^2 r\pi(a_2, a_1) + p(1-p)r\pi(a_2, b_1) + p(1-p)r\pi(a_1, a_1)$$

so basically, want to find 1 state that we get to with prob  $1 - o(p^k)$  that transitions to  $a_1, b_1$  etc.

$$(1-\epsilon)(\pi(a_1, a_2) - \pi(a_1, a_1)) + \epsilon(R - \pi(a_2, a_1))$$

$\epsilon$  ah, can make it as I stated..

$\pi(a_1, a_2) ? \pi(a_1, a_1)$  not necessarily in eg here  $\pi(a_1, a_2)$  bad  $\pi(a_1, a_1)$  good

I think I just need much better notation...

claim:  $r\pi(a_1, a_2) \leq R$  not obvious!!!

why?

ok I need lemma 3 to be stronger

$$\Rightarrow R \Rightarrow \gamma < R$$

ok I just need much better notation...

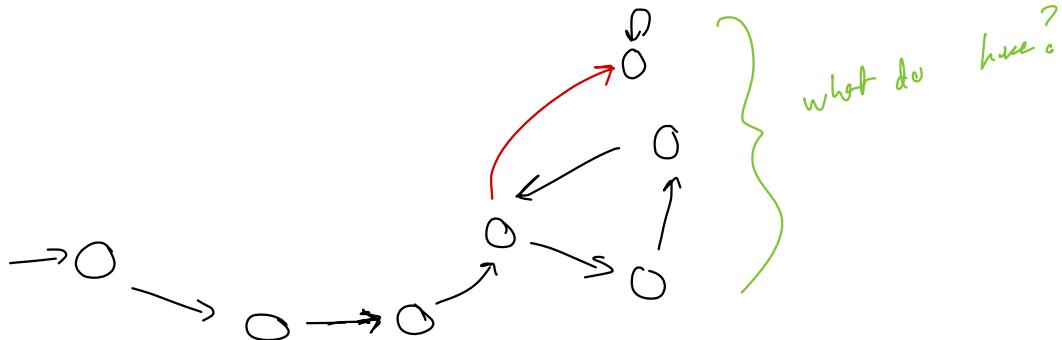
the only thing that matters is lip transitions in the rest can just be made arbitrarily small.

that's almost exactly the proof that I had so much on.

ahhh ok. first need to replicate things exactly until we get to an ergodic subgraph.

PLAN

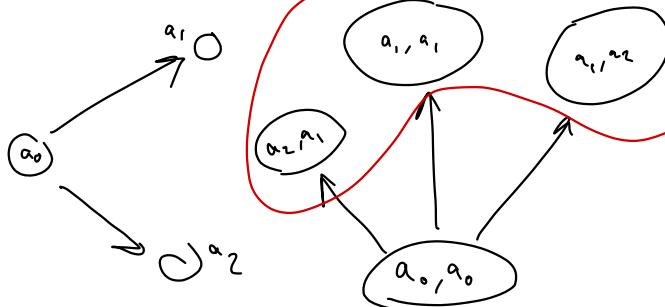
- ① prove it using this weak assumption
- ② try to fix the proof



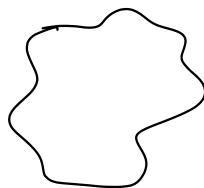
ok yeah the condition  $\lim_{p \rightarrow 0} v_s(s) = R$  condition falls exactly and only about the ergodic state?  
 oh sure yes, but remember that is not the same as just following the big transitions!!! → can do that finitely many times, however.

*assume connected then still about worry periodicity*

ok so what does ergodicity tell us?

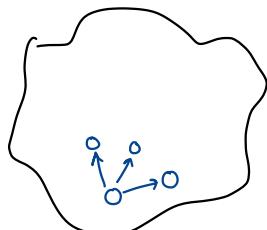


Suppose we get to  
an ergodic subgraph. (only in-edges)



then happy!!

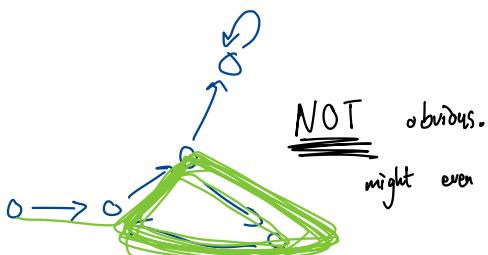
Suppose we get to an isolated  
component (only in-edges)



then will have the same  
time-average distribution because  
there is a unique stationary distribution?

yeah...

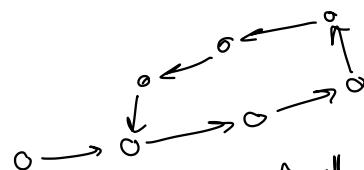
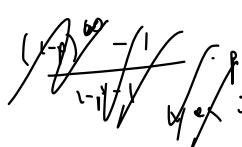
so do we always end up in  
SCC?



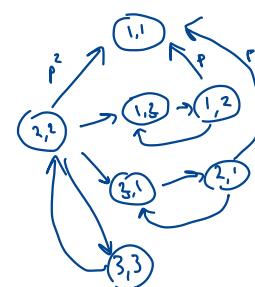
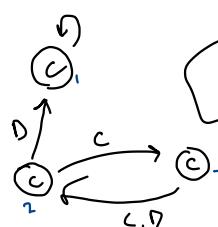
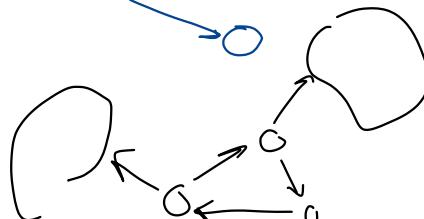
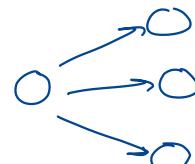
NOT obvious.

might even be false.

can we get this graph?  
remember: playing against itself!



suppose is false for all nodes.  
Then this is obviously NOT a stable state at all.



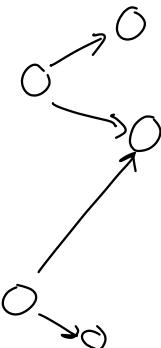
hmm so this is very problematic...

even worse:

ah ah I'm convinced this makes again,  
but it is very annoying.

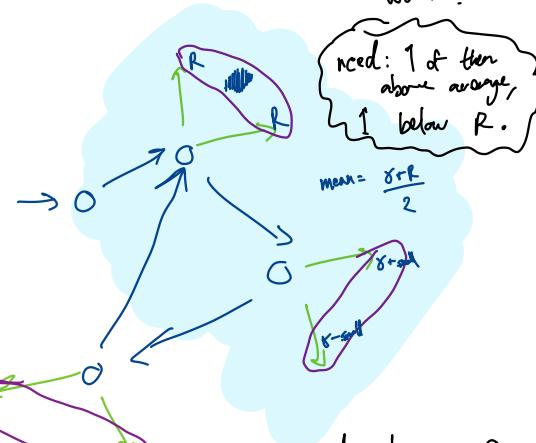
OK, so core issue?

$s_1$  gets information from  $s_2$ .



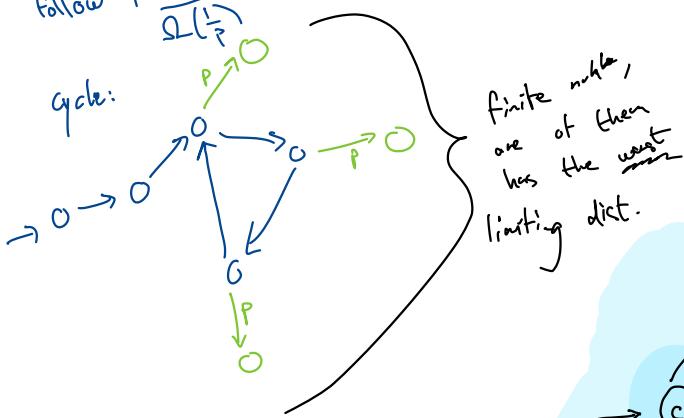
combine best w  
worst.

ahhh.  
if loop on top level, then loop again. so will get one for both



OH ok so this:

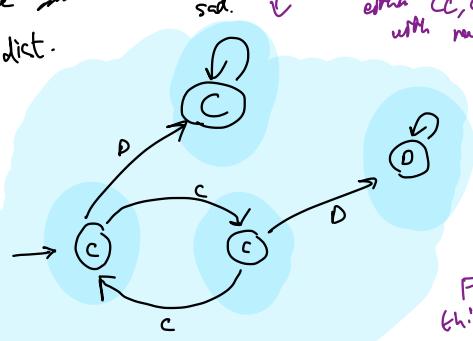
follow  $1 - \frac{1}{\Omega(\frac{1}{p})}$  until get to



ah ok. so just find one that is  $\geq$  mean.

back this is so wtf

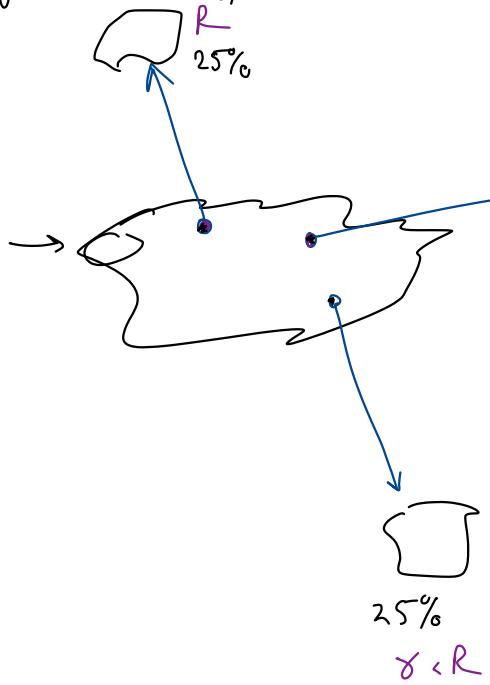
what happens here? obvious that will get to either CC, CD, DC, DD with roughly equal probability.



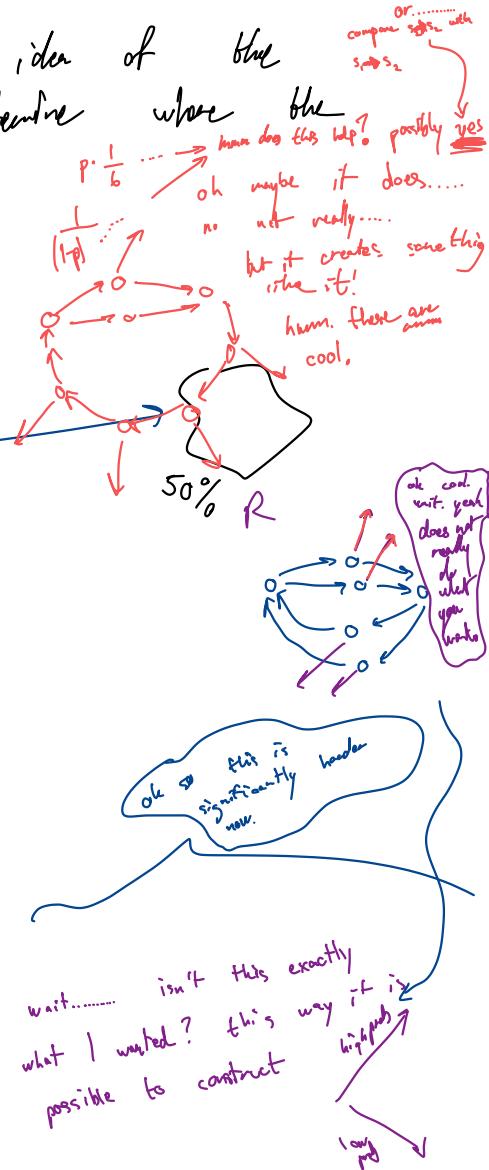
maybe need to do here? TFT recursion?

FUCK this is indeed a counter example what is clear about this? If can choose 50% exact probability for small p which is cool

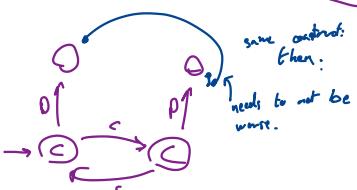
OK... so the problem is my idea of the invading original strategy is.



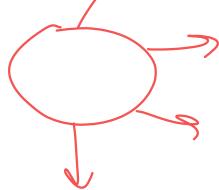
annoying problem: interference



gates for arbitrary prob.



# IDEA



put these ↗ in sequence

oh wow I think that works

for  $s_2 \rightarrow s_2$ : 99% advances

1% revert to  $s_1$

$s_2 \rightarrow s_1$ : 50% advances

50% revert to  $s_2$

can then identify  $s_2$  with itself

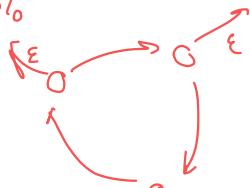
ALWAYS

(but I think this might work on Pauli too. It is pretty cool though)

ok so only problem is if  
S. looks into a bad  
connected component while we're  
doing this.  
→ same problem as  
before

I think Pauli can be  
invaded here ⓘ ⓘ ⓘ  
but this feels like magic  
and kinda sketchy.....

33%



33%

can make extremely  
small by chaining P ↑ together

OK doesn't work.....

but a nice thing to come out  
of this:

we can probably model  
probabilistic finite automata  
as simply normal and  
with added loops  
cycles

not obvious, but would be very  
cool if it worked.

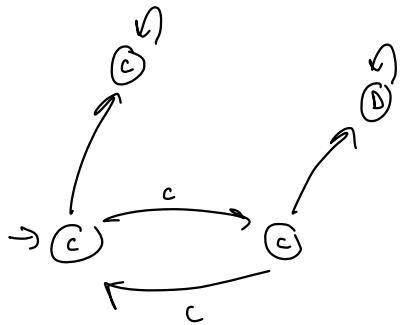
### PLAN:

\* proceed as before.

\* investigate:

\* copy everything, replace  
just in connected component  
that's bad

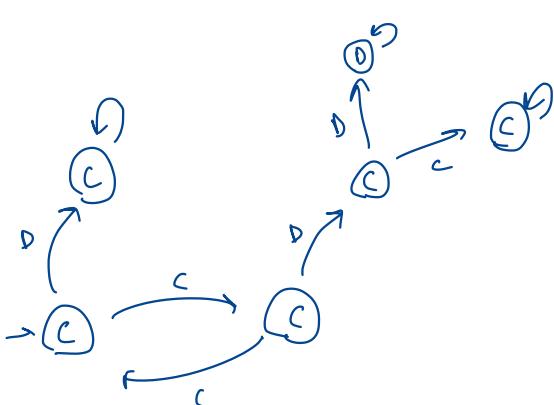
\* I think that's my only  
idea....



how invoke this?

} this one is really iterating, because it's just playing two strategies against each other

can I use that somehow?  
or fake next?



how invoke D?

ok, I'm pretty sure this works.

how generalize???

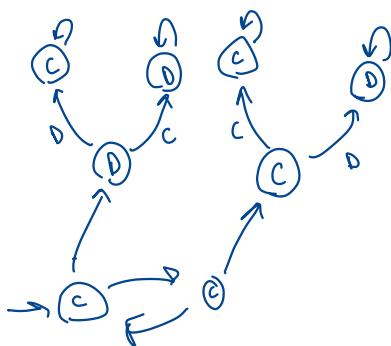
$$(1-\epsilon)(v_{S_1}(s_1) - v_{S_1}(s_1)) + \epsilon(v_{S_2}(s_2) - v_{S_2}(s_2))$$

need to be equal  
to all D.

better against  
itself.



two nice strategies fed against each other?



if feeds release the like multistrategy or  
seeks to one of the  
they with multiple SCCs

oh, not obvious at all, because we can't  
guarantee starting times align.

look only at SCCs!

note: when run very long, will always end up in an SCC.

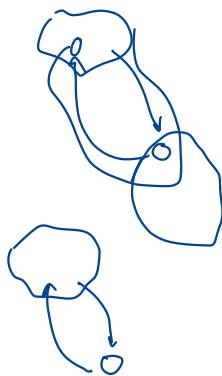
if only modify SCCs themselves, then we know relative  
padding of SCCs always fire same,  
which is nice, also always start in  
the same place of both SCC

ahhhh nice.

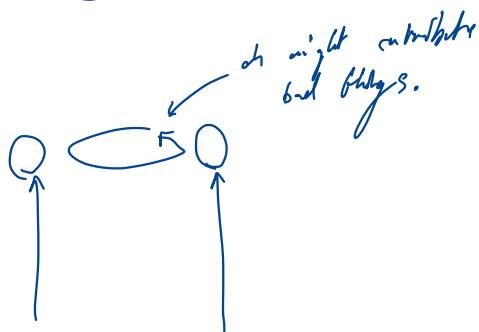
ok. so thing is, given a p, can find an N  
s.t. w prob really high, we can identify in which  
state we are.

theoretically, with prob as close to  
1 as we want, we should be  
able to determine where we  
are. oh. not sure.

so, idea:



key property: once in SCC,  
can make any number  
& uses, without screwing  
up anything, because has  
unique hitting distribution



## IDEA:

replicate everything, except SCCs.  
inside each SCC, can determine  
which SCC opponent is in.

(wait..... wait, anyone?)

} not obvious, and  
ugly.

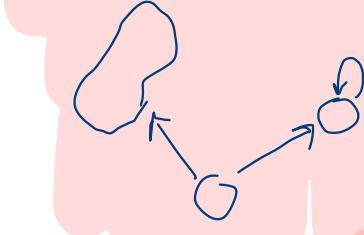
oh, obvious.  
oh, obvious as  $\rightarrow 0$ .

(almost) endless sequence of determinate Cs?  
nah?

oh, we can identify,  
with probability

oh, can we just do original  
idea, after getting to SCC?

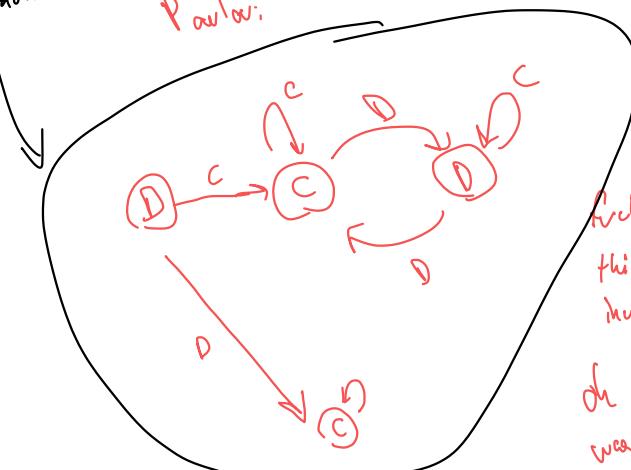
oh, I think so.



take this further?



Paulov:



ridiculous.  
this will indeed  
make Paulov.

oh this what  
we've / created  
merely!

Normal  
how do you know  
what to expect?  
need  
which are or  
PS!

which seems what  
impossible.

NPPE  
Paulov  
is  
very  
true

# OK, THIS WORKS:

replicate  $s_i$  up to SCCs.

for every pair of SCCs in  $s_i$ , find a string  $b$  s.t. they produce different output if deterministic. then, run over all

SCC<sup>2</sup> bs in  $s_2$ , thereby determining which SCC  $s_i$  is in. then, we also know where in the SCC  $s_i$  is, which we then can use for our original strategy, which then chooses the SCC copy.

what happens when we run  $s_2$  against  $s_2$ ?

will be in some state with high probability, thus

reach



!

this relies on: SCCs have unique winning dict, it is possible to talk about SCCs, in SCC, starting position does not matter.

(in fairly certain)  
although, luckily, it is suddenly more interesting.

ughhh this is super ugly now....

can I write this concisely?

do I really need option??  
yes! need it fixed

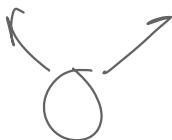
$$v_{s_1}(s_1) = \gamma.$$

$$p_{c_1} \rightarrow c_1.$$

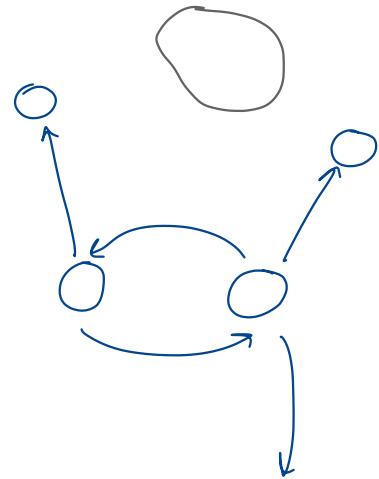
$s_2$ :

+ find action  $s_1$  would take at finite time

\*



—



oh wait, a simpler proof?

$$\frac{R+\delta}{2}.$$

first, check if you're against  
 $s_1$  or  $s_2$ . then either transition  
to a copy of  $s_1$  or to  $\textcircled{C}$ .

Thus, we then only add 1  
new absorbing SCC.

nope nope nope. not necessarily  
same probabilities  $\neq$  than!

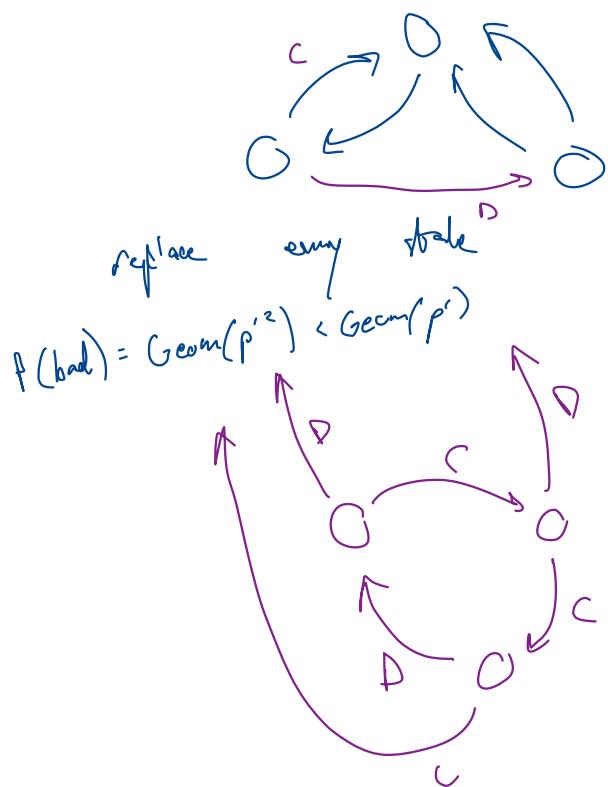
new idea for  $C_2$ :



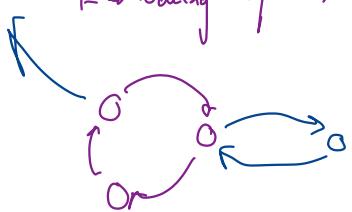
key claims:

- when  $S_1$  is in absorbing SCC, can do whatever you want
- before that, if completely sinklike  $S_1$ , then all is good with the world.

one full cycle of the SCC: prob  $p > 0$  of existing time to entanglement r.v.  
oh wait... can do prob  $(\frac{1}{2})^N$  not sure can be better. oh - require  $N$  recursive initializations  
 $\Rightarrow p^2$  of existing  
 $P(C_2 \text{ ent below } i) = p^i \text{ happens below } p^i$   
 $= \text{Geom}(p^i) < \text{Geom}(p)$



on what it they do  
interlocking cycles

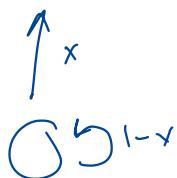


$$P(\text{Geom}(x^2) < \text{Geom}(x)) = O(x)$$

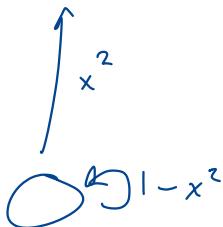


$$\text{when } x \neq 1 - O(p) \Rightarrow x = O(p)$$

$$\frac{1}{2} \\ \frac{1}{2 + \frac{1}{2} p}$$



$$\frac{1}{1+p}$$



$$\frac{p}{1+p}$$

ok: to exit first,

possible problem:  $s_1$  takes  $\infty$  steps until getting to pivot state. not necessarily finite!!!  
in fact:  $s_2$  only advances when it makes a mistake.

so: key problem: recognize itself again  
even bigger problem: close of  $s_2$  might end up in an exact copy of an absorbing SCC

(list all normals  
SCCs  $N$   
Edges )

$$\frac{1}{2}, \frac{1}{2} \cdot x, \frac{1}{2} \cdot (1-x)$$

lose

win

go back

all no zero.  
be broken  
sure that they are !!!

ah, yes, my friend. good riddance my friend.

## OVERALL IDEA

\* simulate  $s_1$  until the real  $s_1$  falls into absorbing SCC with prob  $1 - O(p)$ .  
now,  $s_1$  will always converge to the same thing!

\* determine what action  $s_1$  will take at time  $T$ .

\* self identify. ← (how do we make sure  $s_2$  &  $s_2'$  are in the same state??)

ok then  $s_2$  is only a finite

A steps ahead of  $s_2$ -clone.  
but don't know how many human.



shhh

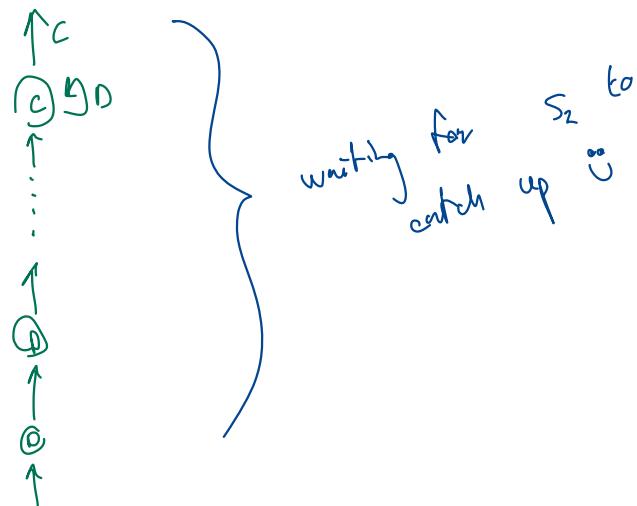
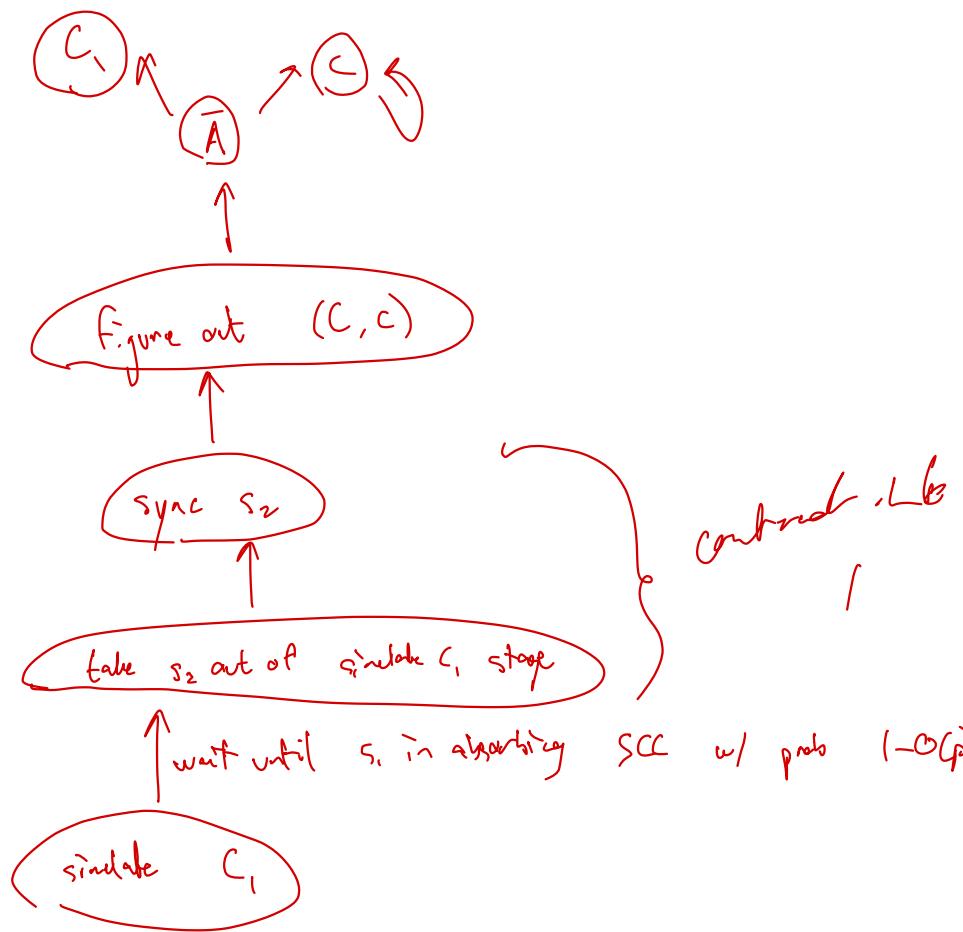
LOL this is too  
fucking intricate but it  
is actually kinda cool.



then: ① determine  $s_1$ 's A at time  $T > \text{max gap}$  possible

② transition into long chain of  $\bar{A}$

③ profit ☺



problem! the virtual version  
is not necessarily synced!

need to know  
what cycle it is

idea:

take

H: what if loop  
behind o

G ahh.  
nice.  
I think  
this is  
prob l.  
nop.

could  
we do something  
simpler? nah this  
is a single  
idea, i'll  
hard to  
write down

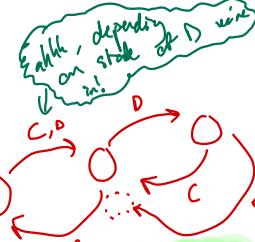
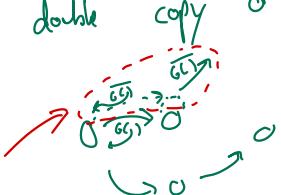
replace every node by a copy of a  
massive graph D. The output at every state  $i \in D$   
is dictated by the state it replaces, and transitions  
between copies of D also.

within D: (this is the hard part)

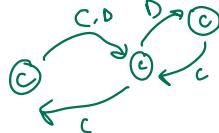
take all transient SCGs as list. ( $N$  of them)

repeat list  $N$  times. also for every state

each is a double copy of the SCC



oh ok, so compare  $\text{Geom}(x)$   
 $\rightarrow D$  and  $\text{Geom}(px)$



a pretty  
to make  
if under  
0% if not  
works.

FML  
dark panic

there should  
be a few more for  
product  
and yup.

the SCC, repeated  
M times

NEED  
EXAMPLE

proof:  $s_i$  will take path  $s_1 \rightarrow s_2 \rightarrow \dots \rightarrow s_k$  <sup>absorbably</sup>  
SCCs

then,



potential lemma: if  $x, y$  absorbing  $\Rightarrow x+y$  absorbing

3  
↓  
0  
↓  
0  
↓  
0  
↓

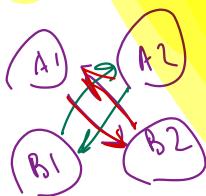
f.x.: we can make  
 $S$  end up where  
we want it to where  
in the strongly connected  
component

just chose  
most advantageous  
one

we could probably do something  
else.

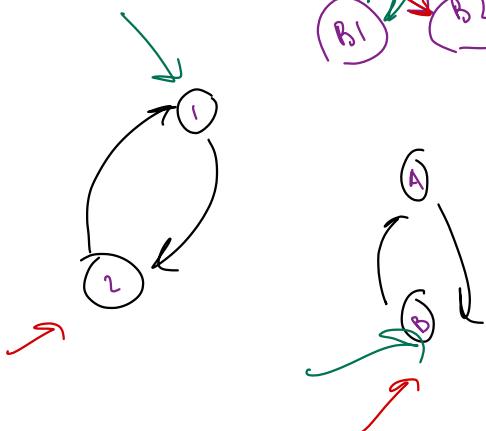
wh. rather define  
between  $(H, K)$  and  $S$ ?  
bijection?

don't panic.



folk

2 SCCs?  
folk does this in  
my whole proof?  
folk it right



0 C

$$\bar{U} = \sum_{S \in \mathcal{S}} P(S_1, S_2 \rightarrow S) \cdot \pi^{(S)}$$

we can't just  
choose the best.  
→ need not  
similar to  $\lambda$ !

$$E\{\text{fraction in } (c_1, c_2)\} =$$

$$= E\{\text{fraction}$$

possible lemmas each  $(H, h)$ ,  $(H', h')$  pair maps  
to one acc.

R+P

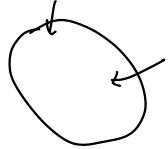
T+S

who learns.



oh we can  
choose the  
best.  
not additional  
complication.

oh, we could also potentially recreate probabilities.  
→ feels ~~very~~ <sup>awfully</sup> hard.



so, choose the best as it is.

prediction: fixing it  
takes 2 hours

OK, so new plan  
think thru!

Lemma 4.13:

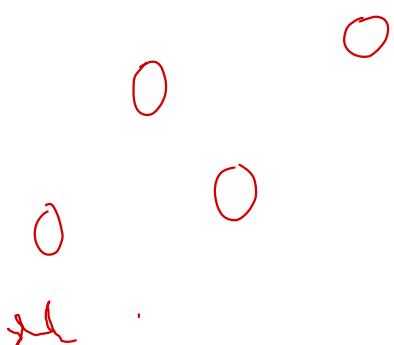
either  $v_{s_1}(s_1) = R \pm O(p)$

or

$$v_{s_2}(s_1) \geq Y \pm O(p)$$

$$\lim_{p \rightarrow 0} v_{s_1}(s_2) < R$$

⇒ to prove



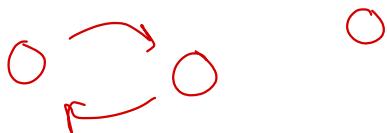
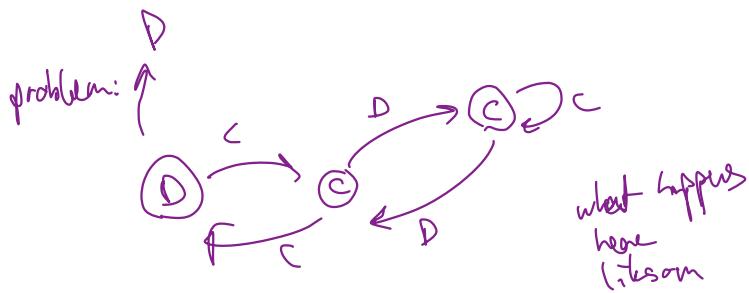
R R R R P P P P P P

TS TS TS TSS TTT

and  $v_{s_1}(s_2) < R$  !

I really do think there's a way  
to fix this.  
could we just

ahh. NICE SOLUTION  
↓



evaluate in which cycle it is, before leaving.

so like:

support this SCC.

evaluate if currently in a cycle  
have a grace period

coffee, and pending  
v-fe, it is...

I'm a genius

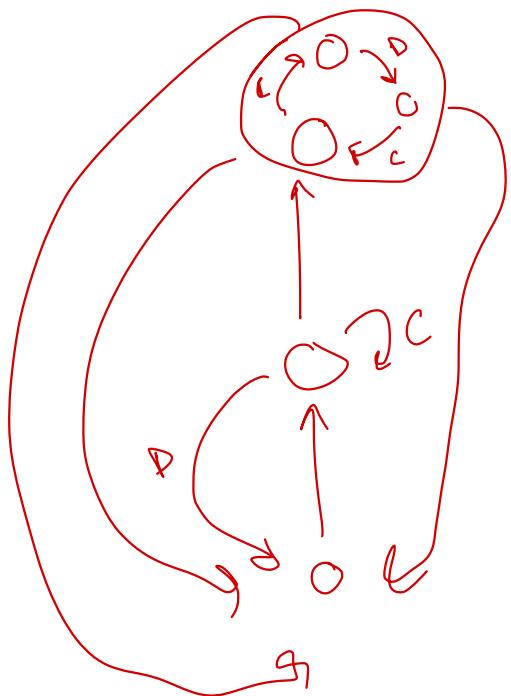
← a TRUE genius.

↳ need something

where  
around  
cycle.

s. has some cycles:  $\{C, CDC, DDC, \dots\}$

b:



pumping lemma  $\leftarrow 3 \leftarrow 3$

↳ then I can  
refer to  
crazier

OK, so drastically simpler way:

take long word that just  
never appears.

but! we'll get to it  
with prob  $\sim p^N$ .  
so eventually we'll be  
there.

so: from every frontier SCC  
there is a way out using  
at most  $n$  edges.

so if input is exactly this, then  
out, so  $P(\text{out}) \geq p^n$   
for a fixed  $n$  for each SCC.

or, even simpler: there is a  
way of getting to some absorbing  
comp in  $n$  steps, so  
 $P(\text{absorb in } n \text{ steps}) \geq p^n$ .

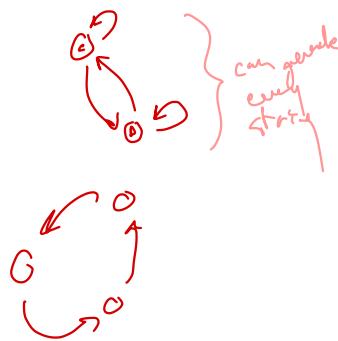
true at every time step  
 $\Rightarrow$  geometric( $p^n$ )

construct a word of length  
 $N > n \Rightarrow$  geometric( $p^N$ ).

use pumping lemma...

$x y^n z$

no " $n$ " what will happen  
with -



$n = \text{diameter of graph}$ .

need: 1 word it  
cannot recognize without  
an error

( $\hookrightarrow$  just repeat  
that  $N$  times.  
ignore C, D fails  
more  
absorb.)

rest: repeat every  
cycle twice, the second  
time making 1 mistake

what will the payoffs be?

I think, exactly what I wrote there.

I need new notation for disregarding

$p(\dots)$  terms though

↑ maybe use?

can use  $O(p) \approx p \rightarrow 0$

what do I need to prove?

→ south south SCCs,

↑ defined simply as "strongly connected components!"

↳ we care only about SCCs which have no outgoing edges

↳ "absorbing SCCs"

unique time average  
distribution

→ every pair of ACCSCCs in  $s_1$  and  $s_2 \leftrightarrow$  every ACCSCCs of their Markov chain

$$V_i(s_2) = \sum_{\text{absorbing SCCs}} p_i \cdot V_i(s_1, s_2)$$

"obvious" thinking.

by Markov chain

yeah, I think I need  
the average thinking  
just skip the expectation  
thingy

why can Pauler not be invaded?

→ good question. important question.

Strategies:

\* suppose invader existed

if better against itself  $\rightarrow$  worse against Pauler

\* any strat against Pauler will get some or worse performance.

\*

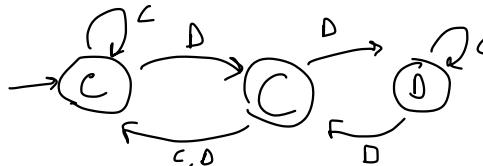


possible invaders?

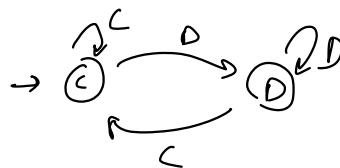
problems with Pauler: spends too much time in D-D state

oh well. that one fails worse against Pauler!!!

better?



overwhelmingly seems like Pauler can't be invaded by this...



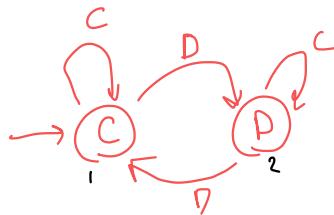
do I need  $2R > T + P$  ??

that would be sad

Pauler vs all D: D-D, D-C vs C-C - however...

PLAN: tonight, try to find an ES strategy.  
 tomorrow, actually write down theorem 1, and state the existence question as an open problem.

OK, I believe Paro is ES. (assuming  $2R > T + P$ )

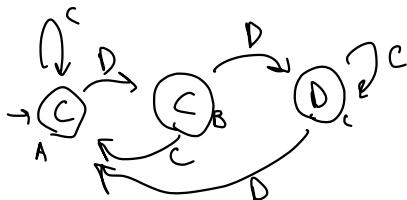


why would it be ES?

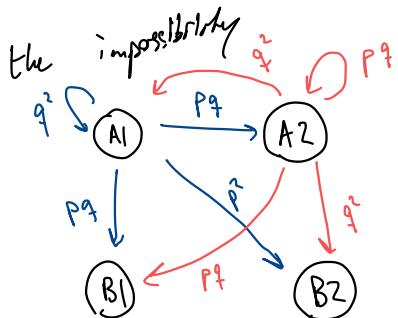
which with optimal move  
of D take?

$$V_{S_2}(s_1) \stackrel{?}{>} V_{S_1}(s_1)$$

seems possible to prove  
of ft.



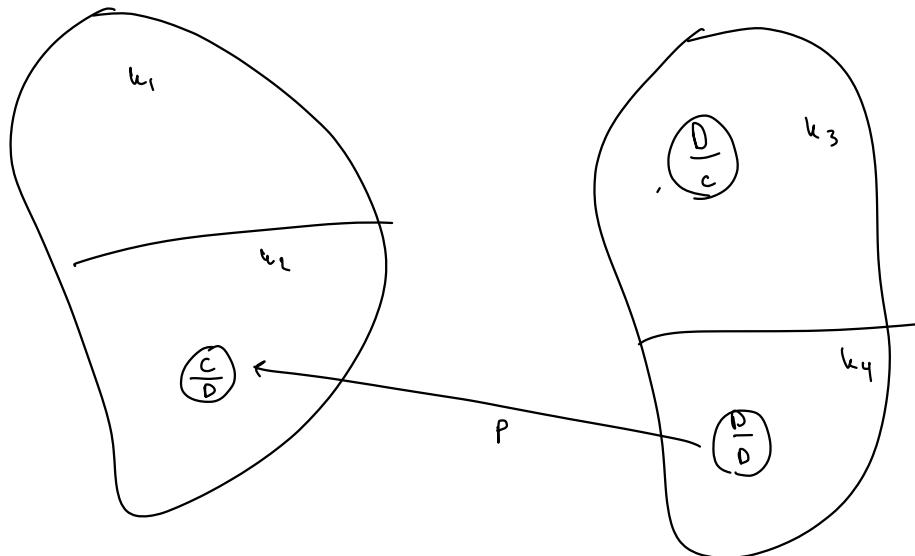
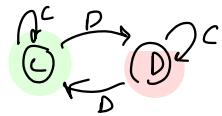
$$q = 1 - p$$



(C1)

(C2)

look at Markov - model  
Color states depending on Markov.

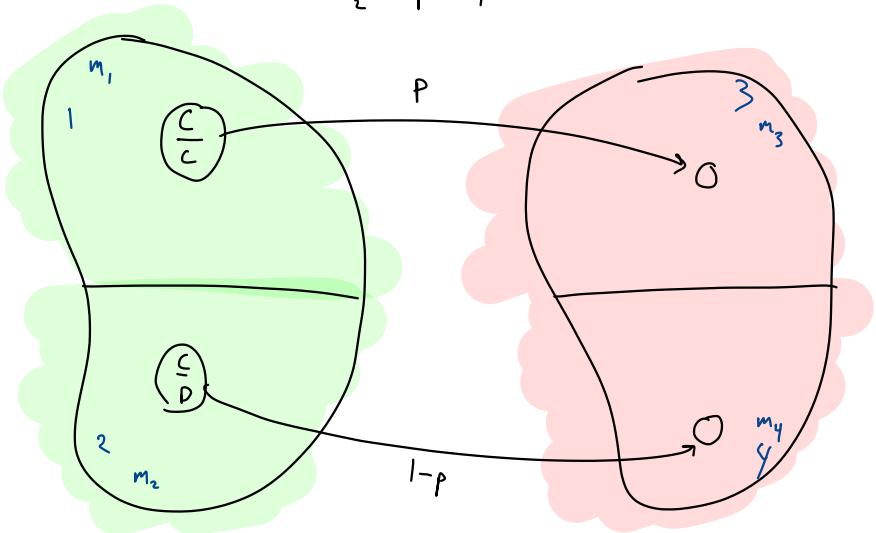


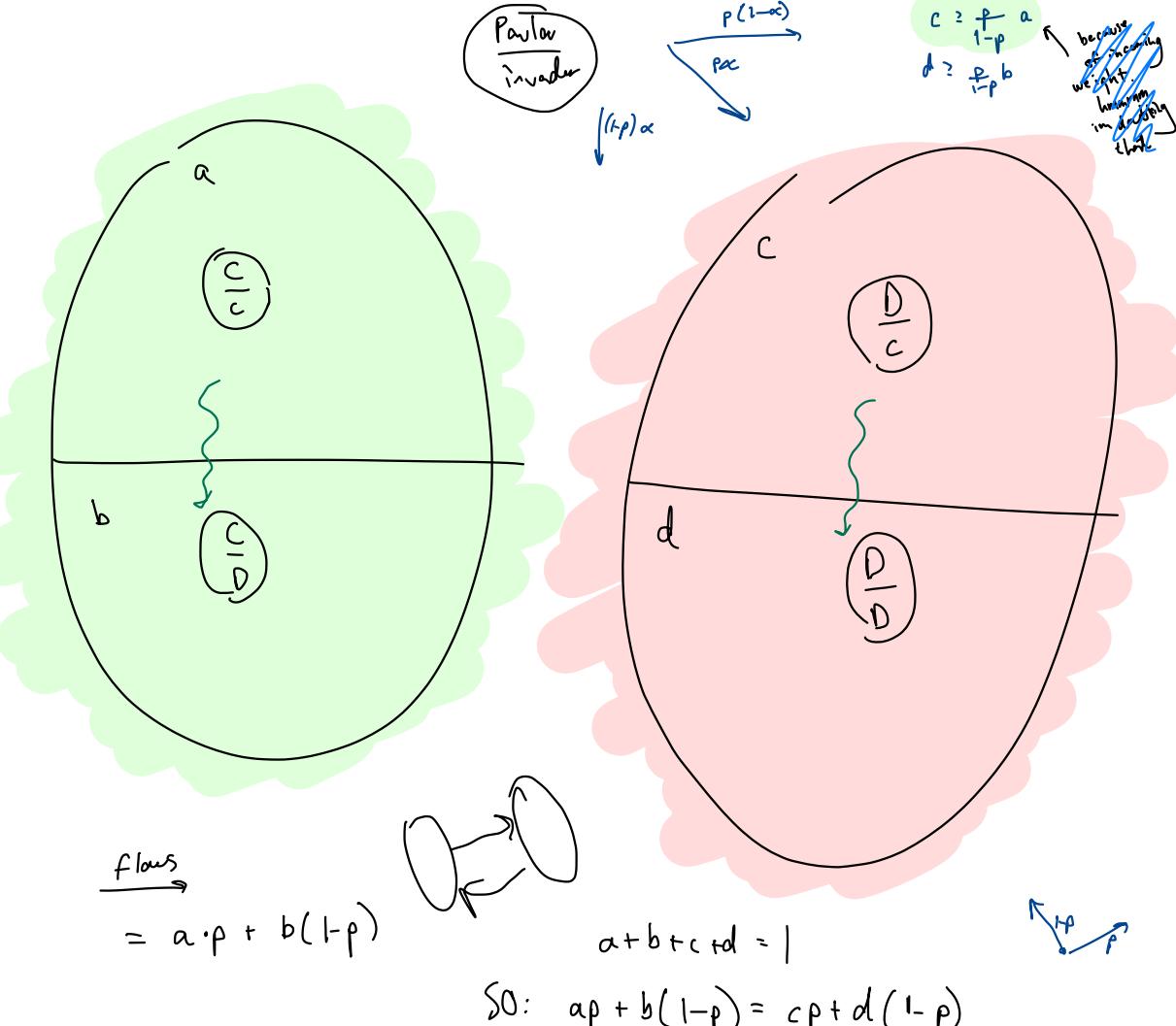
$$m_3 \geq p \cdot m_1.$$

$$m_4 \geq (1-p) \cdot m_2$$

$$\Rightarrow R \geq pm_1 + (1-p)m_2 \geq pm_1 + p(1-p)m_2$$

$$m_2 \geq p \cdot k_4$$





flows

$$= a \cdot p + b \cdot (1-p)$$



$$a + b + c + d = 1$$

$$\text{so: } ap + b(1-p) = cp + d(1-p)$$

flows

$$= d \cdot (1-p) + cp$$

$$\begin{bmatrix} 1 & 1 & 1 & 1 \\ p & 1-p & -p & 1-p \end{bmatrix}$$

$$\begin{bmatrix} 1 \\ 0 \end{bmatrix}$$

want: maximize b, maximize a+b, a+b+d

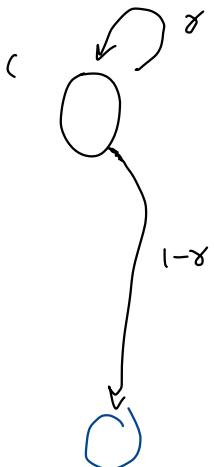
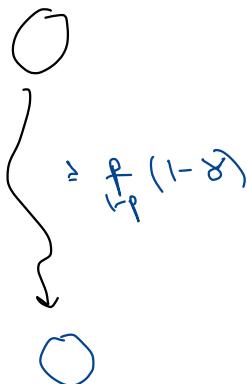
or rather:

$$\text{maximize } R \cdot a + T \cdot b + S \cdot c + P \cdot d$$

may assume wlog  $S=0$  (just shift all)

$$\text{then: maximize } R \cdot a + T \cdot b + P \cdot d \leq R_a + P_d + T \left( \frac{c+d - ap}{1-p} \right)$$

bound from below



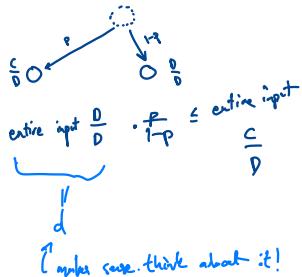
$$x(\dots) = 1$$

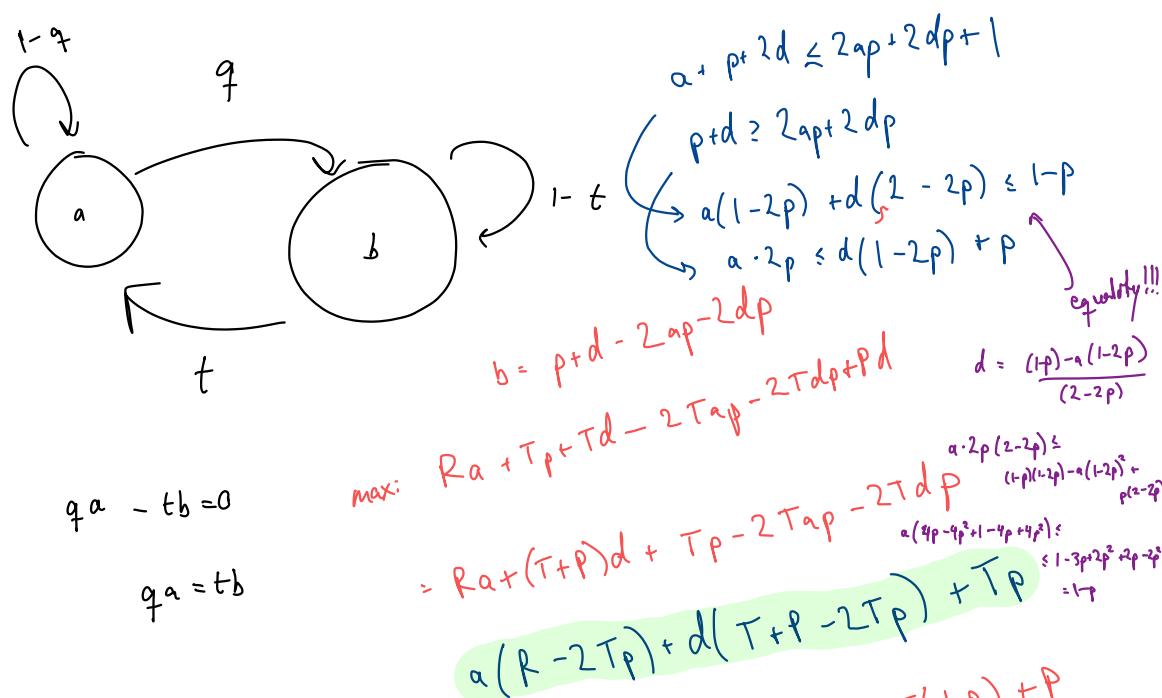
$$\alpha \geq \frac{p}{1-p} (1-\gamma)$$

$$x = \frac{1}{(\dots)} \quad 1-\gamma \leq \frac{1-p}{p} \cdot \alpha$$

$$\gamma \geq 1 - \frac{1-p}{p} \cdot \alpha$$

$$d \cdot \frac{p}{1-p} \leq b$$





$$qa - tb = 0$$

$$qa = tb$$

$$\frac{q}{t} = b \quad \text{given } a, \text{ obviously want to maximize } d.$$

suppose  $a$  is not maximal. then increase  $a$  by  $\delta$ . ??

then, decrease  $d$  by  $\delta \cdot \frac{(1-2p)}{(2-2p)} < \delta$

nice ☺

So: want  $a$  maximal!

$$\alpha + b + c + d = 1$$

$$c = 1 - a - b - d$$

$$ap + b(1-p) = cp + d(1-p)$$

$$ap + b - bp = p - ap - bp - dp + d - dp$$

$$2ap + b = p + d - 2dp$$

$$2ap + 2dp + b = p + d$$

maximize  
 $R_a + Tb + Pd$

$$(1) a + b + c + d = 1$$

$$(2) ap + b(1-p) = cp + d(1-p)$$

$$(3) c \geq \frac{f}{1-p} \cdot a \quad \text{not tight!}$$

$$(4) b \geq \frac{f}{1-p} \cdot d \quad \text{not tight!}$$

goal: maximize  $R \cdot a + T \cdot b + S \cdot c + P \cdot d$

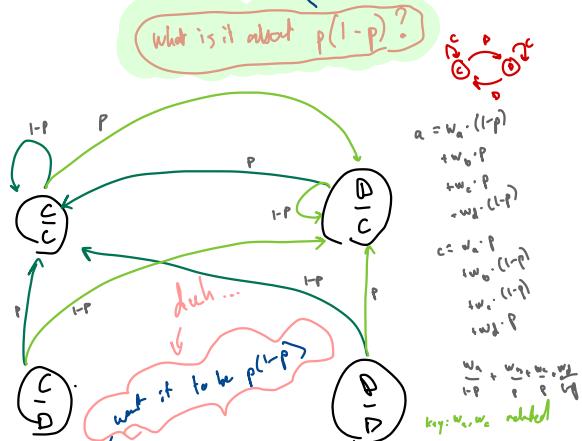
may assume wlog.  $S = 0$ , so

$$\max(Ra + Tb + Pd)$$

$$(2) \Rightarrow ap + b - bp = p - ap - bp - dp + d - dp \Rightarrow \\ \Rightarrow b = pd - 2ap - 2dp$$

$$\text{insert: } Ra + T(p+d-2ap-2dp) + Pd = \\ = a(R - 2Tp) + d(T + P - 2Tp) + Tp \quad \text{← constraint}$$

$$(4) \Rightarrow p + d - 2ap - 2dp \geq \frac{p}{1-p} \cdot d \Rightarrow \\ \Rightarrow pd - 2ap - 2dp - p^2 - pd + 2ap^2 + 2dp^2 - 2pd \geq 0 \\ \Rightarrow a(-2p + 2p^2) + d(1 - 4p + 2p^2) + p - p^3 \geq 0 \\ \Rightarrow a \cdot 2p \cdot (1-p) \leq d(2(1-p)^2 - 1) + p(1-p)$$



$$(3) \Rightarrow 1 - a - b - d \geq \frac{p}{1-p} \cdot a \Rightarrow 1 - a - d \geq \frac{pa}{1-p} + p + d - 2ap - 2dp \Rightarrow$$

$$\Rightarrow a\left(1 + \frac{p}{1-p} - 2p\right) + d(2 - 2p) \leq 1 - p$$

fix  $a$ . then, want  $d$  as big as possible. so,

$$d = \frac{(1-p)^2 - a(1-p + p - 2p(1-p))}{2(1-p)^2} = \frac{w_a}{w_a + w_c + w_d}$$
  
 $= \frac{1}{2} - a\left(\frac{1}{2} + \frac{1}{(1-p)^2} - \frac{p}{1-p}\right)$

[OH THIS WORKS]

IF can prove  $c \geq p(1-p)$ , then DONE

(i think)

$$w_a = a \cdot (c_{cc} \overset{1}{\circ} + g_{cc} \overset{(1-p)}{\circ} + g_{cc} \overset{p}{\circ} + c_{cd} \overset{0}{\circ})$$

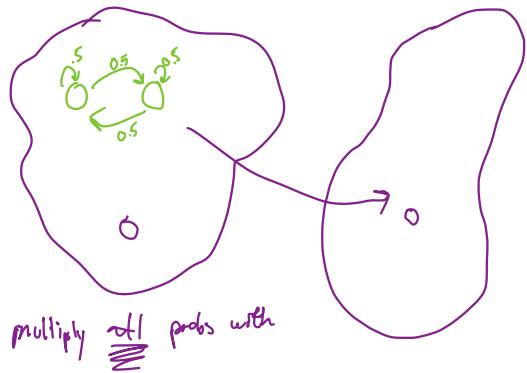
YAYYY  
don't you have  
not remember

and so on  
then minimize when all equal!!!!  
(which happens with  $p(1-p)$ !!!!)  
that is,  $c_{cc} + g_{cc} + g_{cc} + c_{cd} = 1$   
can very happen you want  
but is minimized when  $g_{cc} = 1$

(problem:  $c_{cd} \dots$ )

(relies on:  $2p(1-p) < p^2 + (1-p)^2$   
good old AM-GM :)

$$a = w_a \cdot (1-p) + w_b \cdot p + w_c \cdot p + w_d \cdot (1-p)$$



what is it about  $p(1-p)$ ?



$$a = w_a \cdot (1-p)$$

$$+ w_b \cdot p$$

$$+ w_c \cdot p$$

$$+ w_d \cdot (1-p)$$

$$c = w_a \cdot p$$

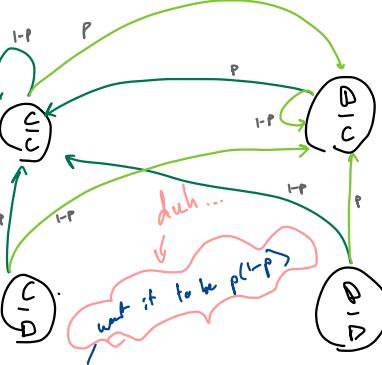
$$+ w_b \cdot (1-p)$$

$$+ w_c \cdot (1-p)$$

$$+ w_d \cdot p$$

$$w_a + w_b + w_c + w_d = 1$$

key:  $w_a, w_c$  related



$$p - 2dp \Rightarrow$$

$w_a$  comes from  
always  $c$   
switches  $c$

$$so, c \rightarrow C \quad p - dp$$

$$w_a = a \cdot (c \rightarrow c + g \rightarrow c + g \rightarrow c)$$

$$w_c = c \cdot (c \rightarrow c + g \rightarrow c + g \rightarrow c)$$

too good to be true!!

[OH THIS WORKS!]

think)

fraction of mass in  $\frac{C}{C}$

$$c \rightarrow c + g \rightarrow c + g \rightarrow c = 1.$$

$$w_a = a \cdot (1 \cdot c \rightarrow c + (1-p) \cdot g \rightarrow c + p \cdot g \rightarrow c + 0 \cdot c \rightarrow d)$$

$$w_c = c \cdot (1 \cdot c \rightarrow c + p \cdot g \rightarrow c + (1-p) \cdot g \rightarrow c + 0 \cdot c \rightarrow d)$$

$$c = w_b \cdot (1-p) + w_d \cdot p +$$

$$+ a(p \cdot c \rightarrow c + p(1-p)g \rightarrow c + p^2g \rightarrow c)$$

$$+ c((1-p)c \rightarrow c + p(1-p)g \rightarrow c + (1-p)^2g \rightarrow c)$$

$C \quad C$



Suppose for a sec  
that we don't  
allow  $c \rightarrow d$

$$a = w_b \cdot p + w_d \cdot (1-p)$$

$$+ a((1-p)c \rightarrow c + (1-p)^2g \rightarrow c + p(1-p)g \rightarrow c) + c(p \cdot c \rightarrow c + p^2g \rightarrow c + p(1-p)g \rightarrow c)$$

key question: is the fraction of the mass the same?

$$\begin{aligned} \alpha \cdot p^2 d &\leq 2ap + 2dp \\ \Rightarrow apd + 2ap + 2dp &\\ \Rightarrow d(1-2p) + d(1-p) &\leq 1-p \\ \Rightarrow -2dp + d + dp &\leq 1-p \\ \Rightarrow -dp &\leq 1-p \\ \Rightarrow p &\geq 1-p \end{aligned}$$

$$C = \frac{p}{1-p} \alpha$$

conditions are

$$\Rightarrow \frac{pa + a + p + 2d}{1-p} \leq 2ap + 2dp + 1$$

$$\alpha = 1-p ?$$

$$2d \leq 2p - 2p^2 + 2dp$$

$$d \leq p$$

$$\boxed{\begin{array}{l} \alpha = 1-p \\ d = p \end{array}}$$

$$\therefore d(1-2p) \leq 2p - 2p^2 - p$$

$$\frac{pa + a - dp + p - p^2 + 2d - 2dp}{1-p} \leq 2ap + 2dp + 1 - 2ap^2 - 2dp^2$$

$$a(1-2p + 2p^2) + d(2-4p + 2p^2) \leq 1-2p + p^2$$

$$a((1-p)^2 + p^2) + 2d(1-p)^2 \leq (1-p)^2$$

again, given  $a$ , want to maximize  $d$   
so, will want equality!

$$\text{that is, } d = \frac{1}{2} - \alpha \left( \frac{1}{2} + \frac{p^2}{2(1-p)^2} \right)$$

$$a \cdot 2p(1-p)^2 \cdot 2 \leq (1-2p)((1-p)^2 - ap^2 - a(1-p)^2) + 2p(1-p)^2$$

$$a \left( 4p(1-p)^2 + (1-2p)(1-p)^2 + (1-2p)p^2 \right) \leq (1-2p)(1-p)^2 + 2p(1-p)^2$$

$$\underbrace{(1+2p)(1-p)^2}_{(1+2p)(1-p)^2}$$

$$+ (1-2p)p^2$$

$$\underbrace{(1-p)^2}_{(1-p)^2}$$

$$1+2p - 2p - 4p^2 + p^2 + 2p^3 + p^2 - 2p^3$$

$$a(1 - 2p^2)$$

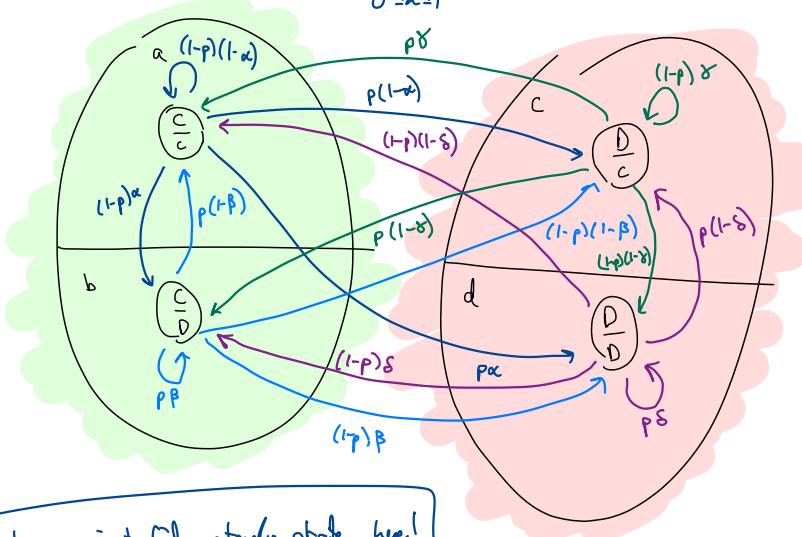
$$\Rightarrow a \leq \frac{(1-p)^2}{1-2p^2}$$

$$a = \frac{1 - 2p + p^2}{1 - 2p^2} .$$

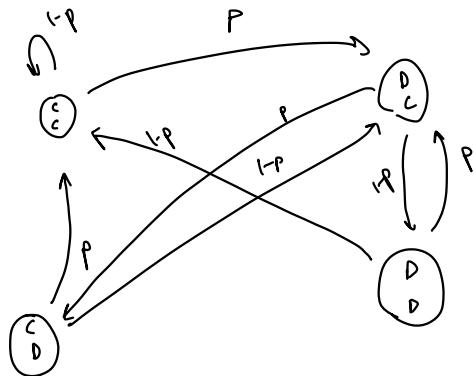
$$d = \frac{1}{2} - \frac{1}{2} \cdot \frac{(1-p)^2 + p^2}{1 - 2p^2}$$

now interesting.  $d \cdot 2 - p^2$  is the need  $d$ .

$\alpha$ : an average flow  
 $0 \leq \alpha \leq 1$



# unknown = 8  
# eqs = 5



problem is:  $\alpha, p, \gamma, \delta$   
count all in O.

but we can  
reduce  $\alpha$ ?

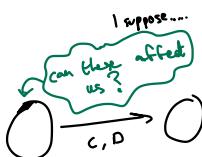
what does  $\alpha=0$  mean?

that from C, always go to C.



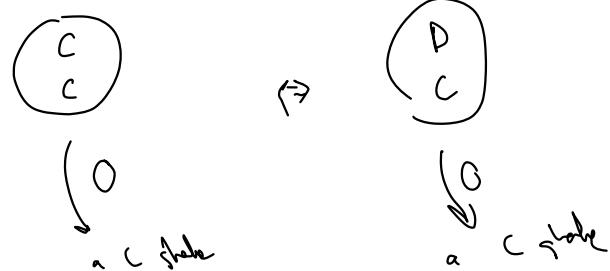
which is bad for us

in particular,  $\alpha=0 \Rightarrow \gamma=1$



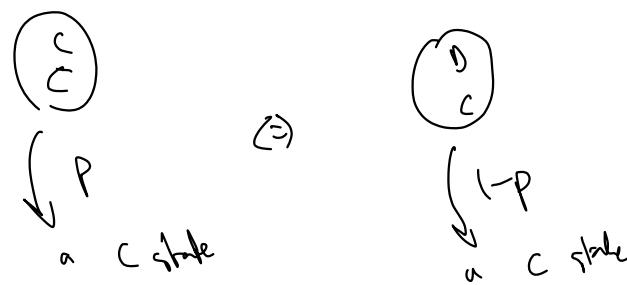
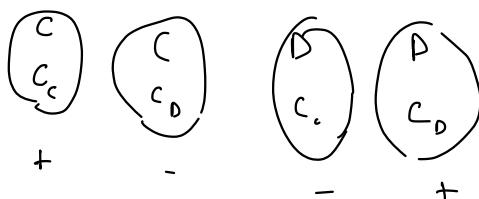
can we formalize the relationship between  
 $\alpha$  and  $\gamma$ ?

$\alpha = \text{uhhh unclear}$



so the  $\binom{D}{C}$  weights

$$\text{are always } = \frac{P}{1-P} \cdot \binom{C}{D}$$



$$\alpha = \xi = \frac{\sum w_i \cdot o_i}{\sum w_i} \quad (1-P) \quad (\Rightarrow) \quad P$$

$$\gamma = \frac{\sum w_i \cdot \tilde{o}_i}{\sum w_i} \quad | \quad (\Leftrightarrow) \quad |$$

suppose  $\alpha < p$ . then certain weight in c state

$$\sum w_i = w_{cc} + w_c$$

$$\sum w_i = w_{cc'} + w_{c'}$$

$\text{J}^{1-p}$

$\frac{1}{2}$

$\frac{1}{2}$



$\text{J}^p$

$\text{J}^1$

$$\frac{p^2}{(1-p)^2 + p^2}$$

$$\frac{\frac{p}{1-p}}{\frac{1-p}{p} + \frac{p}{1-p}} =$$

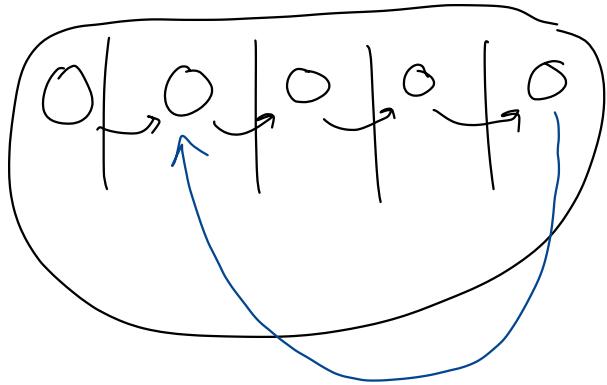
$$= \frac{p^2}{(1-p)^2 + p^2}$$

$$\frac{1-p}{p} x$$

$$\frac{p}{1-p} x$$

fuck at strong enough  
board.

could bin based on distance to  
choice node:



Lemmn 4.1:

$$\text{time average } \alpha_{c_1, c_2}^{(a,b)} = E \left[ \text{fraction at time in } (c_1, c_2) \mid \text{initial } (a, b) \right]$$



$$M \pi \stackrel{e}{=} \pi$$

$$E \left[ \text{fraction in } (c_1, c_2) \mid \text{initial } (a, b) \right] \stackrel{e}{=} \sum_{\substack{u \in S \\ (u, (c_1, c_2)) \in \text{Markov}}} p_{u \rightarrow (c_1, c_2)} \cdot E \left[ \text{fraction in } u \mid \text{initial } (a, b) \right]$$

$$\stackrel{e}{=} E \left[ \sum_u p_{u \rightarrow (c_1, c_2)} \cdot (\text{fraction in } u) \mid \text{initial } (a, b) \right]$$