

# MECHANISM DESIGN

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**Lecture #9 – 02/21/2022**

**CMSC498T**  
**Mondays & Wednesdays**  
**2:00pm – 3:15pm**



**COMPUTER SCIENCE**  
UNIVERSITY OF MARYLAND

# **QUIZ REVIEW!**

# LAST WEEK

## Stable marriage problem

- Bipartite, one vertex to one vertex
- Gale-Shapley can always find this in poly-time by having jockeys propose to horses, but this favors jockeys
- There are lots of variants of the problem that break theory

## Stable roommates problem

- Not bipartite, one vertex to one vertex
- Irving's algorithm finds a stable matching if it exists, otherwise reports failure

## Hospitals/Residents problem

- Bipartite, one vertex to many vertices
- Actually used in practice (NRMP, lawyers, sororities)
- Lots of finicky details for handling complementaries

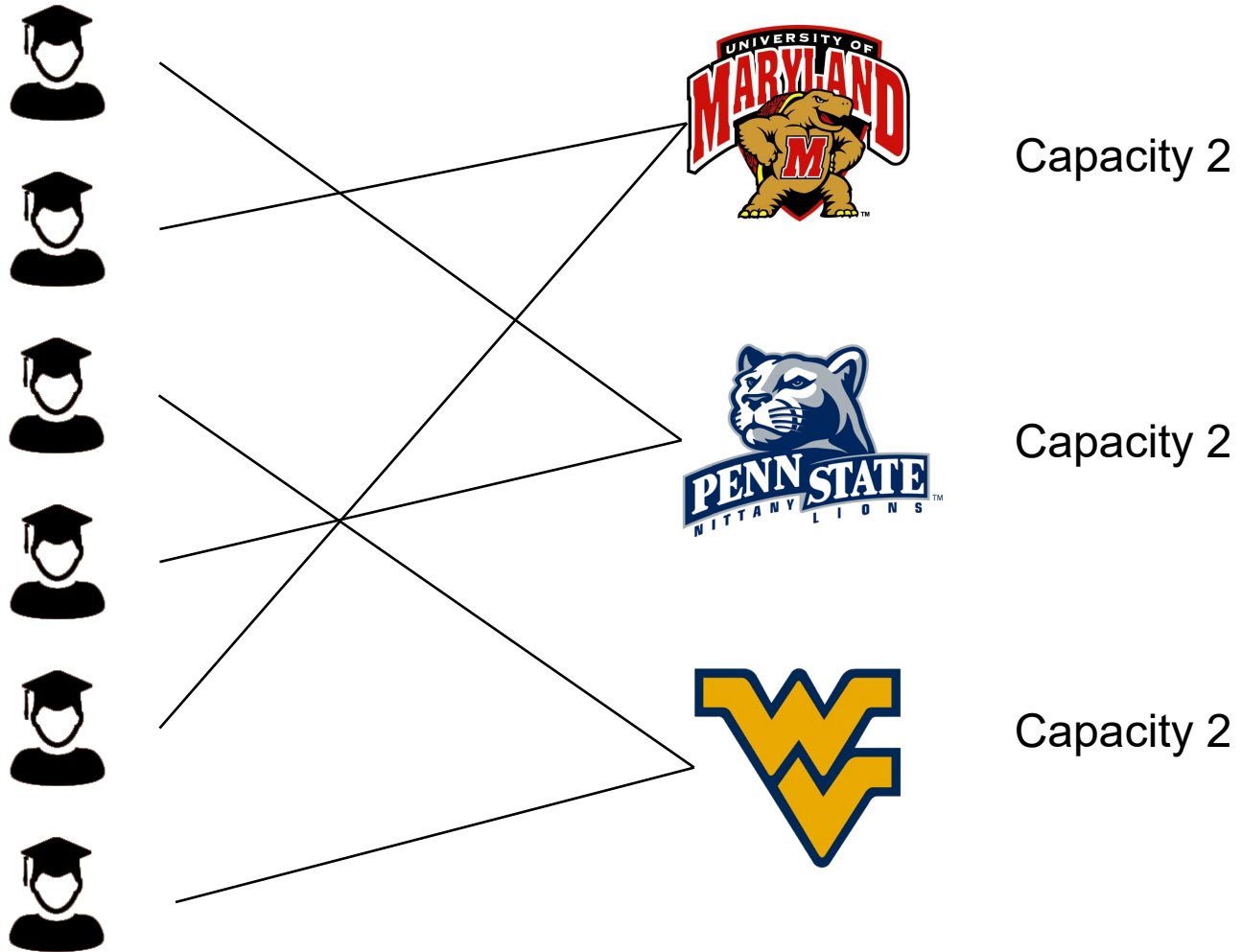
**THIS CLASS:  
THE AFFILIATE MATCHING PROBLEM  
(DOOLEY & DICKERSON '20)**

# ACTIVITY TIME!

Take this survey:

<https://tinyurl.com/affmatch>

# THE BASIS: ONE-TO-MANY



# AFFILIATIONS



Capacity 2



Capacity 2



Capacity 2

# AFFILIATIONS



Does the student like this?

Does Penn State like this?

Does UMD like this?



Capacity 2



Capacity 2



Capacity 2

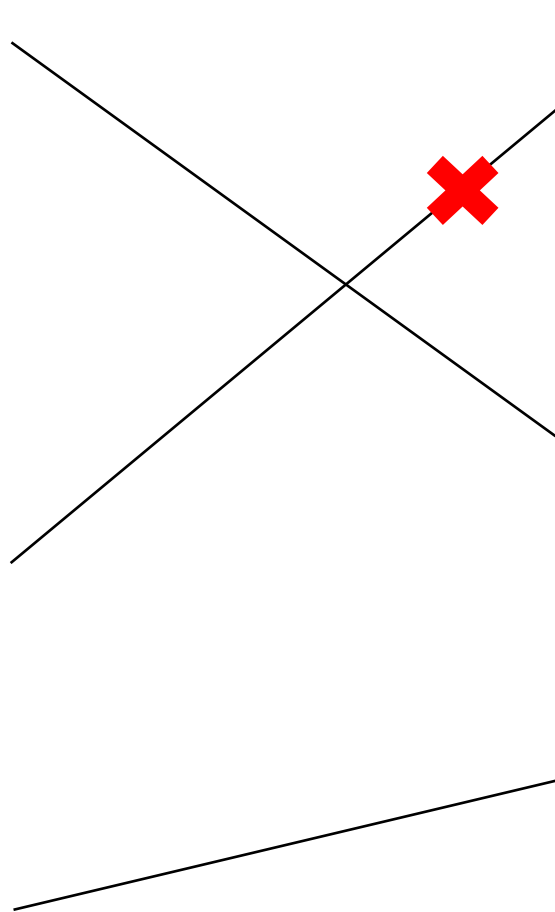


# AFFILIATIONS

Student would rather match to WVU



Student would rather match to UMD



UMD likes its match but REALLY prefers its students to go to WVU than PSU.



Capacity 1

Capacity 1

Capacity 1

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Student would rather match to WVU



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Capacity 1

UMD likes its match but REALLY prefers its students to go to WVU than PSU.



Capacity 1



Capacity 1

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Capacity 1



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Capacity 1

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Capacity 1



Capacity 1

# AFFILIATIONS: A MATHEMATICAL FORMULATION

Let  $U$  be the universities and  $S$  be the students.

Student preferences are just a ranked list over universities.

## What about university preferences?

Let the capacity of a university be  $c(u)$

For a university  $u$ , let its affiliates be  $aff(u)$  where  $n(u) = |aff(u)|$

- $n(u)$  is the number of affiliates
- $u$  has a ranked list over  $S^{c(u)} \times U^{n(u)}$
- Its and its affiliates matchings

*Note: this notation differs from the associated paper*



$$c(u) = 4$$



UMD cares about:

- Its 4 matches
- Affiliate 1 match
- Affiliate 2 match

This is a 6-tuple:

$(s, s', s'', s''', u', u'')$

# UNDERLYING PREFERENCES

## Setting

- 3 schools: UMD, PSU, WVU
- 3 students: Alex, Ryan, Taylor



**Say UMD has a general preference over applicants it wants and schools it likes for Alex.**

- $Alex >_{UMD} Ryan >_{UMD} Taylor$
- $Penn\ State >_{UMD} Maryland >_{UMD} West\ Virginia$

**How will UMD rank overall matchings?** It only cares about it's and Alex's match.

Represent a matching as: *(UMD's match, Alex's match)*

# UNDERLYING PREFERENCES

$Alex >_{UMD} Ryan >_{UMD} Taylor$

$Penn\ State >_{UMD} Maryland >_{UMD} West\ Virginia$

Matchings: (UMD's match, Alex's match)

Consider the following *partial* ranks UMD might have over matchings:

1.  $(Alex, PSU) >_{UMD} (Alex, WVU) >_{UMD} (Ryan, UMD)$
2.  $(Alex, WVU) >_{UMD} (Alex, PSU) >_{UMD} (Ryan, UMD)$
3.  $(Alex, UMD) >_{UMD} (Taylor, PSU) >_{UMD} (Ryan, PSU)$
4.  $(Alex, UMD) >_{UMD} (Ryan, PSU) >_{UMD} (Taylor, PSU)$

**Which of these matches are impossible?**



**Disregarding impossible matches, which of these seem “rational” given UMD’s underlying preferences?**

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4.  $(Alex, UMD) >_{UMD} (Ryan, PSU) >_{UMD} (Taylor, PSU)$

**Which of these matches are impossible?**

(Alex, PSU): how can UMD be matched to Alex, but Alex is matched to PSU?



**Disregarding impossible matches, which of these seem “rational” given UMD’s underlying preferences?**



# UNDERLYING PREFERENCES

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**Which of these matches are impossible?**

$(Alex, PSU)$ : how can UMD be matched to Alex, but Alex is matched to PSU?



Capacity 1



Capacity 1



Capacity 1

**Disregarding impossible matches, which of these seem “rational” given UMD’s underlying preferences?**

1 seems rational, 2 does not.

# UNDERLYING PREFERENCES

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Matchings: (UMD's match, Alex's match)

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**Which of these matches are impossible?**

(Alex, PSU): how can UMD be matched to Alex, but Alex is matched to PSU?



**Disregarding impossible matches, which of these seem “rational” given UMD’s underlying preferences?**

1 seems rational, 2 does not.

4 seems rational, 3 does not.

**How do we capture “rationality”?**

# CONSISTENT PREFERENCES

In this model, we call “rational” preferences **consistent**. Say  $>_u$  is  $u$ 's preference over complete matchings,  $>'_u$  is its preference over students, and  $>''_u$  is its preference over universities.

Formally:

An employer's preference profile  $>_u$  *consistent* with  $>'_u$  (resp.  $>''_u$ ) if the ordering of the first element of each tuple preserves  $>'_u$  (resp.  $>''_u$ ).

$Alex >'_UMD Ryan >'_UMD Taylor$

$Penn State >''UMD Maryland >''UMD West Virginia$

Then which is consistent with  $>'_UMD$  and  $>''UMD$  ?

$(Ryan, PSU) >_UMD (Taylor, PSU) >_UMD (Ryan, WVU)$

$(Ryan, PSU) >_UMD (Ryan, WVU) >_UMD (Taylor, PSU)$

# CONSISTENT PREFERENCES

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$Alex >'_{UMD} Ryan >'_{UMD} Taylor$

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Then which is consistent with  $>'_{UMD}$  and  $>''_{UMD}$  ?

$(Ryan, PSU) >_{UMD} (Taylor, PSU) >_{UMD} (Ryan, WVU)$

$(Ryan, PSU) >_{UMD} (Ryan, WVU) >_{UMD} (Taylor, PSU)$

$>''_{UMD}$

$>'_{UMD}$

We call this  
“affiliate-  
agnostic”

# SURVEY: DO REAL PREFERENCES VARY?

You are  
BMU,  
your  
affiliate is  
Ryan.

	BMU and Ryan top tier ←				BMU and Ryan bottom tier →				
	Scenario								
	1	2	3	4	5	6	7	8	9
Top 1	80%	49%	40%	47%	50%	42%	38%	42%	38%
Top 2	48%	26%	24%	27%	25%	18%	20%	22%	18%
Top 3	19%	20%	13%	23%	18%	12%	11%	10%	11%
Top 4	18%	15%	12%	14%	13%	10%	9%	9%	9%
Top 5	18%	15%	12%	14%	13%	10%	9%	9%	9%

Table 1: Percentage agreement for *most common* Top  $k$  elements of the of the preference profile across the nine scenarios. The ‘Top 1’ condition reports the percentage of respondents who agreed with the most common outcome which they *most prefer*. The ‘Top 2’ condition reports the percentage of respondents who agreed with the most common outcome for the *most and second most preferred*. ‘Top 5’ reports the percentage of respondents who agreed on the most common full preference profile  $\succ$ .

## Takeaways:

- 1/10 – 1/5 respondents agreed on complete profiles each question
- Agreement is much higher for Top 1 and 2 (anecdotal strategies)
- Agreement is higher when BMU and Ryan are top-tier

# ARE PEOPLE CONSISTENT?

In other words, did people agree with any consistent profile (there are four possible options)?

- This varied from 1/100 to 1/4 respondents
- Generally higher when BMU and Ryan are higher tier
- 1<sup>st</sup>, 4<sup>th</sup>, 7<sup>th</sup>: Ryan is top-tier -> consistency is higher

	<i>BMU and Ryan top tier</i> ←									<i>BMU and Ryan bottom tier</i> →		
	Scenario											
	1	2	3	4	5	6	7	8	9			
Consistency Frequency	26%	7%	4%	14%	4%	4%	9%	2%	1%			

Table 2: Percentage of full preference profiles which were consistent for each scenario.

# SURVEY LIMITATIONS

**What are some survey limitations (either ones you know where true or suspect are true)?**

- Respondents were non-experts in faculty hiring
  - Social desirability: you respond in ways you think would be viewed as favorable, if someone were to see your responses
  - More noisy
- Only 154 “successful” respondents
- Priming: randomly assign some participants to believe prioritizing affiliate’s matches would be good
  - No effect was found – either priming was done poorly or there is simply no effect in this setting



# GREEDY STABILITY

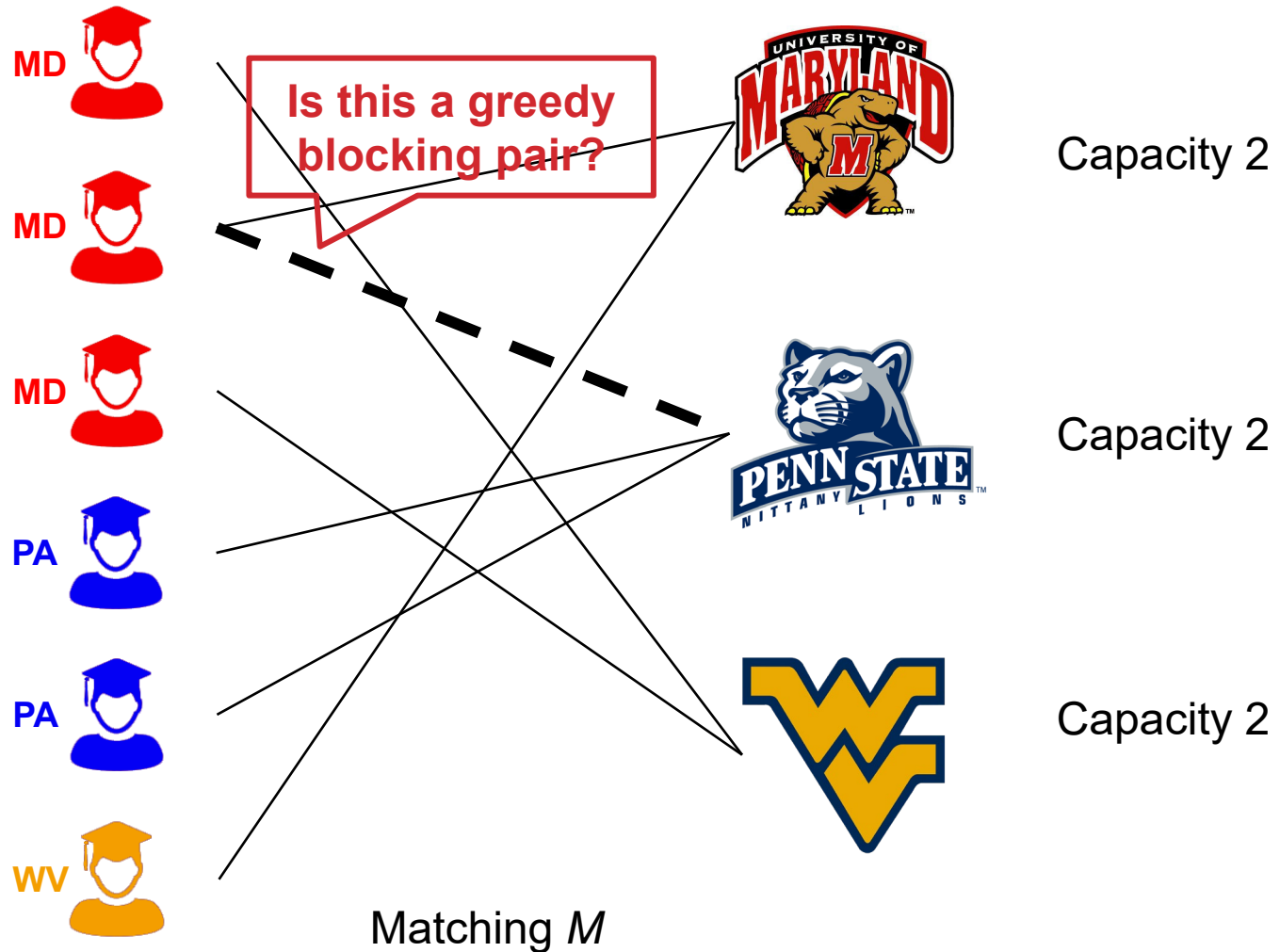
Consider a matching  $M$ , and say the match of any agent  $a$  under  $M$  is  $M(a)$ .

$(Alex, UMD)$  is a **greedy blocking pair** iff  $UMD \succ_{Alex} M(Alex)$  and there exists some other matching  $M'$  where  $M'(Alex) = UMD$  and  $(M'(UMD), M'(aff(UMD))) \succ_{UMD} (M(UMD), M(aff(UMD)))$ .

- AKA,  $(Alex, UMD)$  is a greedy blocking pair exactly when they are not matched and there is another matching that matches them which both prefer

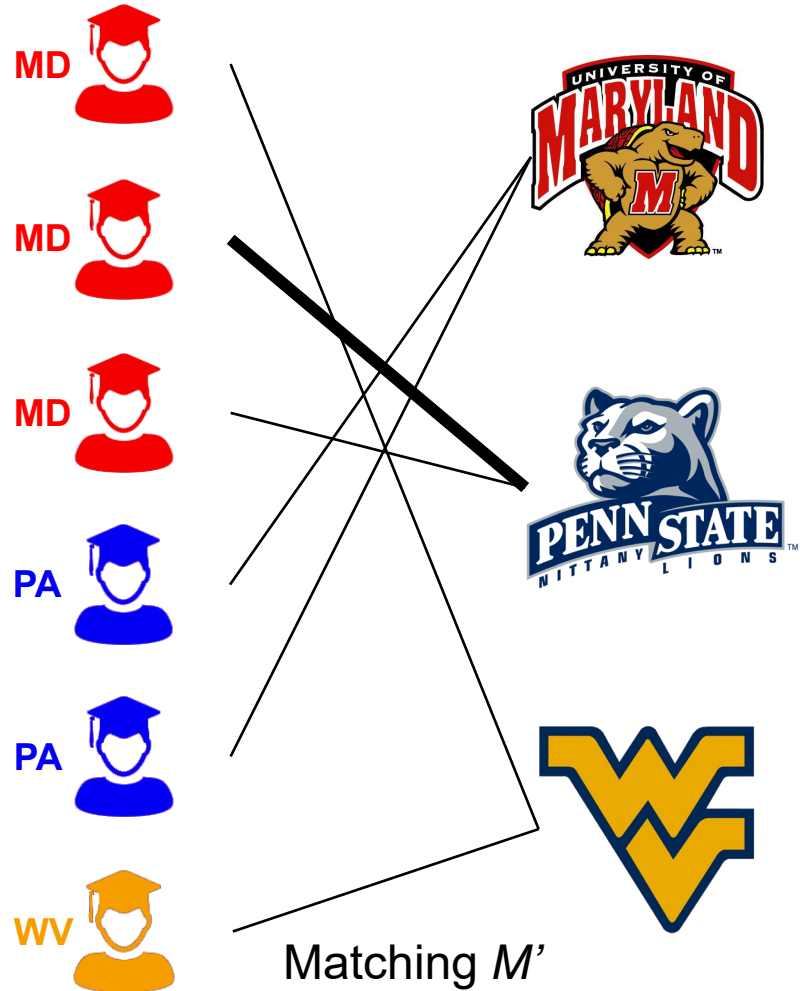
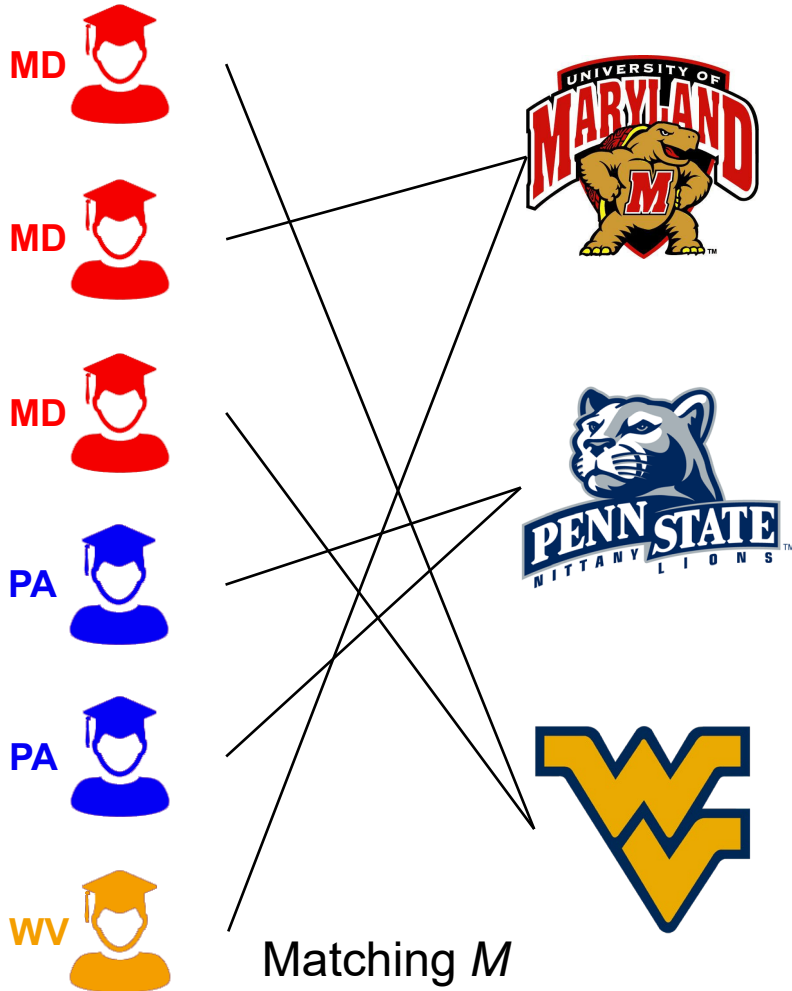
A matching is **greedy stable** if there are no greedy blocking pairs.

# GREEDY STABILITY



# GREEDY STABILITY

If the newly matched pair is happier in  $M'$ , then  $M$  is unstable



# PROPERTIES OF GREEDY STABILITY

**Recall:** A marketplace is *affiliate-agnostic* if all university preferences are consistent with their preferences over students.

- AKA: Universities care about their own matches first and foremost, and then their students' matches







## Proposition

In an affiliate-agnostic marketplace, the problem reduces to stable marriage.

# PROPERTIES OF GREEDY STABILITY

We no longer assume the marketplace is affiliate-agnostic.

Then, there may be no stable matchings.

$WV > PA > MD$	 MD A	 MD	$(R, WV) > (A, MD) > (T, PA) > (R, PA) > (T, WV)$
$MD > WV > PA$	 PA R	 PA	$(A, WV) > (T, WV) > (A, MD) > (T, MD) > (R, PA)$
$WV > MD > PA$	 WV T	 WV	$(A, MD) > (R, MD) > (T, WV) > (R, PA) > (A, PA)$

# DESIGNING AFFILIATE MATCHING MECHANISMS

*Does an affiliate matching mechanism reify notions of prestige in a way that produces harm?*

- If you go to a prestigious school, you likely access to better resources that give you a better outcome.

*How do current affiliate marketplaces operate?*

- Can this model be used in some way? Is preference elicitation reasonable?  
Can we make it strategy-proof?

*How much do employers care about their affiliates? How much **should** they care?*

- Qualitative results in the survey yielded many different philosophies.

*What is the right definition of stability?*

- Greedy stability is not the only notion of stability. Is it too weak? To strong?  
Helpful? Unhelpful?

# EXTENSION: DICHOTOMOUS PREFERENCES

**Similar existing marketplaces are simplified:** each applicant submits their top 2 preferences, schools do initial acceptances based off of this, then it is decentralized.

**Why is this good?**

- It's easy for people to submit their top 2

**Affiliate matching:** should students give entire rankings over schools? Can they? Can schools give entire rankings over tuples?

**Simplification:** Everyone has a binary approval/disapproval indicator for each university/student

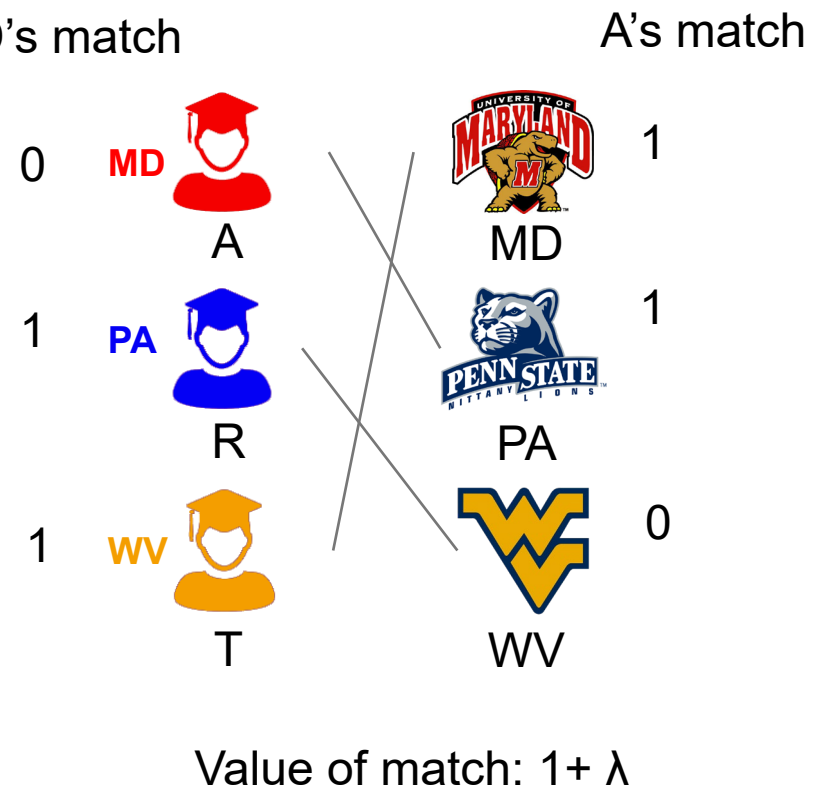
# EXTENSION: DICHOTOMOUS PREFERENCES

## UMD's Preferences:

- Approve or disapprove of each UMD's match student for itself
- Approve or disapprove of each university for each affiliate

## Value of a matching:

- Start at 0
- Add 1 for every match it receives that it likes
- Add  $\lambda$  for every match an affiliate receives that it likes





# THE VALUE OF DICHOTOMOUS PREFS

**Preference elicitation** – simple, easy to get, will never contradict itself

**Problem solvability** – there is always a stable solution and it can be found efficiently (even in many-to-many matches)

**Problems?** – is it over simplified? Is our notion of valuation “right”? Does this really model real world problems?

**Proposed problems** – faculty hiring *interviews*, playdates!, study abroad, student projects, dog breeding

# HERE IS A DOGGO

