

# Directed search on the marriage market

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## Introduction

Person of your dreams  $\Leftrightarrow$  Second best option  
Smaller share of resources  $\Leftrightarrow$  Higher share of resources  
Low matching probability  $\Leftrightarrow$  High matching probability

# Introduction

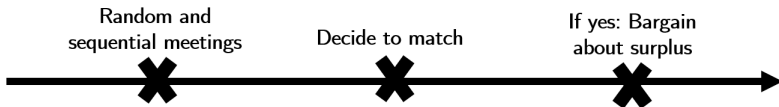
## In general

- Static two-sided directed search model applied to marriage market
- Trade-off between
  - Partner characteristics (i.e., race and education)
  - Marriage terms (i.e., labor supply division)
  - Matching probability
- Unravel male and female preferences (given observed matches)
  - Variation in gender ratios across regions

## Introduction

### Directed search vs. Traditional random search

Traditional (random) search model



Directed search model



## Introduction

### Contributions

- Literature applying directed search to marriage market
- Modeling advantages compared to random search model
  - NTU: individual-specific preferences separately identified
  - Modeled behavior is more efficient and realistic
  - Including market tightness
- Terms of marriage = Labor supply division
  - Individuals can commit to certain terms,  
⇒ e.g., man works FT, woman works FT

[▶ Details](#)

### Chade, Eeckhout and Smith (2017)

"Consider for example the market for executives. In the random search framework, executives must randomly be paired with janitor jobs, to only reject those."

# Model

## 1. Individuals

- Each male (female) is characterized by several observed traits, summarized by a type  $m$  ( $f$ ), where  $m$  ( $f$ )  $\in \{1, 2, \dots, M$  ( $F$ ) $\}$
- Let  $im$  stand for the  $i$ -th member of type  $m$
- $R$  possibilities to specify terms of marriage, where one particular possibility will be  $r \in \{1, 2, \dots, R\}$
- Every man (woman) makes a discrete choice to search in one of the  $F \times R$  ( $M \times R$ ) markets, within his (her) own region [▶ Details](#)
  - Terms are determined and fixed once market is chosen
  - No (re)negotiation
  - Marriage contract

# Model

## 1. Individuals

- Expected utility of an  $m$ -type man searching for an  $f$ -type woman with marriage terms  $r$  depends on
  - Matching probability  $P_m^{fr}$
  - Deterministic part of utility conditional on matching  $\mu_m^{fr}$
  - Individual-specific preference term  $\epsilon_{im}^{fr}$

$$E(U_{im}^{fr}) = P_m^{fr} \cdot e^{\mu_m^{fr} + \epsilon_{im}^{fr}} \quad (1)$$

$$\ln(E(U_{im}^{fr})) = \mu_m^{fr} + \ln(P_m^{fr}) + \epsilon_{im}^{fr} \quad (2)$$

- Utility of not matching = 0

# Model

## 1. Individuals

- Man  $i$  of the  $m$ -type men decides to search on the  $\{f, r\}$ -market when

$$\{f, r\} = \arg \max_{f', r'} \mu_m^{f'r'} + \ln(P_m^{f'r'}) + \epsilon_{im}^{f'r'} \quad (3)$$

- $\epsilon_{im}^{f'r'}$ 's are i.i.d. type I extreme value errors

$$\Pr(f, r|m) = \phi_m^{fr} = \frac{\exp(\mu_m^{fr} + \ln[P_m^{fr}])}{\sum_{f'} \sum_{r'} \exp(\mu_m^{f'r'} + \ln[P_m^{f'r'}])} \quad (4)$$



# Model

## 2. Matching

- $X_{mfr}$  = Number of matches in  $\{m, f, r\}$ -market
  - Matching function
  - Inputs = Number of searching men and searching women
  - Output = Number of matches
- $\phi_m^{fr} N_m$  and  $\phi_f^{mr} N_f$  = Number of searching men and women
  - $\phi_m^{fr}$  and  $\phi_f^{mr}$  = Searching probabilities
  - $N_m$  and  $N_f$  = Number of  $m$ -type men and  $f$ -type women

$$X_{mfr}(\phi_m^{fr} N_m, \phi_f^{mr} N_f) = A[(\phi_m^{fr} N_m)^\rho + (\phi_f^{mr} N_f)^\rho]^{1/\rho} \quad (5)$$

- $A$  = Matching efficiency/Search frictions
- $\rho$  = Substitution parameter

## Model

### Substitution parameter $\rho$

- $\rho \leq 1 \Rightarrow \rho < 0$
- If  $0 < \rho \leq 1$ 
  - "Too many" matches (i.e., more matches than available partners)
  - Not possible
- If  $\rho \rightarrow 0$ , CES function = Cobb-Douglas
  - Gender ratio drops out of matching prob.
  - Not desirable

# Model

## 2. Matching

- By assuming that all m-type men searching in the same market have the same matching probabilities,  $P_m^{fr}$  can be written as

$$\begin{aligned} P_m^{fr} &= \frac{X_{mfr}}{\phi_m^{fr} N_m} = \frac{A[(\phi_m^{fr} N_m)^\rho + (\phi_f^{mr} N_f)^\rho]^{1/\rho}}{\phi_m^{fr} N_m} \\ &= A \left[ 1 + \left( \frac{\phi_f^{mr} N_f}{\phi_m^{fr} N_m} \right)^\rho \right]^{1/\rho} \end{aligned} \quad (6)$$

- $\ln[P_m^{fr}]$  enters  $\phi_m^{fr}$  = Influence of gender ratio on search decisions

## Model

### 3. Equilibrium

- Whether or not searching on a market  $\Rightarrow$  Matching probabilities
- Matching probabilities  $\Rightarrow$  Search probabilities
  - Amount of competitors on particular market
  - Amount of potential partners on particular market
- Search probabilities become

$$\phi_m^{fr} = \frac{\exp\left(\mu_m^{fr} + \ln[P_m^{fr}(\phi_m^{fr}, \phi_f^{mr})]\right)}{\sum_{f'} \sum_{r'} \exp\left(\mu_m^{f'r'} + \ln\left[P_m^{f'r'}(\phi_m^{f'r'}, \phi_f^{m'r'})\right]\right)} \quad (7)$$

- Equilibrium obtained by solving for the fixed point defined by Equation 7

# Model

## 4. Identification

- Two marriage markets:  $\{m, f, r\}$  and  $\{m, f, r'\}$

### Theorem

Take  $G_{mf} = N_m/N_f$ . If  $\rho < 0$  and  $\mu_f^{mr'} - \mu_f^{mr} > \mu_m^{fr'} - \mu_m^{fr}$ , it holds that:

$$i) \quad \frac{\phi_f^{mr}}{\phi_m^{fr}} < \frac{\phi_f^{mr'}}{\phi_m^{fr'}}$$

$$ii) \quad P_f^{mr} > P_f^{mr'} \text{ and } P_m^{fr} < P_m^{fr'}, \text{ and}$$

$$iii) \quad \frac{\partial(\phi_f^{mr'} / \phi_f^{mr})}{\partial G_{mf}} > 0 \text{ and } \frac{\partial(\phi_m^{fr'} / \phi_m^{fr})}{\partial G_{mf}} > 0.$$

# Model

## 4. Identification

*Elasticity of the probability of matching wrt the gender ratio:*

- $G_{mf} = 1$ ,  $\phi_m^{f'r} = \phi_f^{mr} = \phi_m^{f'r'} = 0.5$ ,  $\phi_f^{mr'} = 0.6$ ,  $\rho = -2$

$$\frac{\partial \ln P_m^{f'r}}{\partial G_{mf}} = - \left[ \left( \frac{\phi_m^{f'r}}{\phi_f^{mr}} \right)^\rho G_{mf}^{\rho+1} + G_{mf} \right]^{-1} = -0.5 < -0.41 = - \left[ \left( \frac{\phi_m^{f'r'}}{\phi_f^{mr'}} \right)^\rho G_{mf}^{\rho+1} + G_{mf} \right]^{-1} = \frac{\partial \ln P_m^{f'r'}}{\partial G_{mf}}$$

$$\frac{\partial \ln P_f^{mr}}{\partial G_{mf}} = \left[ \left( \frac{\phi_f^{mr}}{\phi_m^{f'r}} \right)^\rho G_{mf}^{-\rho+1} + G_{mf} \right]^{-1} = 0.5 < 0.59 = \left[ \left( \frac{\phi_f^{mr'}}{\phi_m^{f'r'}} \right)^\rho G_{mf}^{-\rho+1} + G_{mf} \right]^{-1} = \frac{\partial \ln P_f^{mr'}}{\partial G_{mf}}$$

# Data

## Dataset individuals

- ACS Public Use Microdata Sample (PUMS): 5y-estimates
  - 2015-2019
- Sample size (25-65 years old + married or cohabiting)
  - (Heterosexual) Couples: 2 288 182
  - Singles: 1 775 807

## Gender ratios

- ACS: Sample gender ratios
- 51 US regions (50 states + District of Columbia)

▶ Descriptive statistics

▶ Matching distributions

# Estimation

## Utility functions

$$\mu_{m}^{fr} = \alpha_1^m SE_{mf} + \alpha_2^m PE_f + \alpha_3^m SR_{mf} + \sum_{j=1}^4 I(PR_f = j) \alpha_{4j}^m + \sum_{k=1}^9 I(ToM_{mf} = k) \alpha_{5k}^m \quad (8)$$

$$\mu_f^{mr} = \alpha_1^f SE_{mf} + \alpha_2^f PE_m + \alpha_3^f SR_{mf} + \sum_{j=1}^4 I(PR_m = j) \alpha_{4j}^f + \sum_{k=1}^9 I(ToM_{mf} = k) \alpha_{5k}^f \quad (9)$$

with

- $SE \in \{0, 1\} \Rightarrow$  Same education
- $PE \Rightarrow$  Partner's education
- $SR \in \{0, 1\} \Rightarrow$  Same race
- $PR \Rightarrow$  Partner's race
- $ToM \Rightarrow$  Terms of marriage: labor supply division



# Estimation

## Labor supply division

Woman	Man		
	HW	PT	FT
HW	{HW,HW}	{HW,PT}	{HW,FT}
PT	{PT,HW}	{PT,PT}	{PT,FT}
FT	{FT,HW}	{FT,PT}	{FT,FT}

## Estimation

### Likelihood function

$$\begin{aligned} \mathcal{L}_{if}(\theta) = & I(y_{if} = 1) \left[ \sum_m \sum_r I(d_{if} = \{m, r\}) (\ln[\phi_f^{mr}(\theta)] + \ln[P_f^{mr}(\theta)]) \right] \\ & + I(y_{if} = 0) \ln \left[ \sum_m \sum_r \phi_f^{mr}(\theta) \times (1 - P_f^{mr}(\theta)) \right] \end{aligned} \quad (10)$$

with

- $\theta = \{\alpha, \rho, A\} \Rightarrow$  Needs to be estimated
- $y_{if} = 1 \Rightarrow$   $i$ -th woman of type  $f$  is matched
- $d_{if} =$  Search decision;  $s \in \{1, \dots, 51\} =$  Regions

$$\hat{\theta} = \arg \max_{\theta} \left( \sum_s \sum_f \sum_{i=1}^{N_f^s} \mathcal{L}_{if}^s(\theta) + \sum_s \sum_m \sum_{i=1}^{N_m^s} \mathcal{L}_{im}^s(\theta) \right) \quad (11)$$

# Results

## Structural model estimates

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### A. Matching parameters

$\rho$	-9.1472 (0.5496)
$A$	0.9127 (0.0064)
$-\log(L)$	16462200
Time	+/- 5 days

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# Results

## Structural model estimates

Preferences	B. Men	C. Women
Same education ( $\alpha_1^m$ )	0.5946 (0.0045)	0.8589 (0.0131)
Partner's education ( $\alpha_2^m$ )	0.0690 (0.0093)	-0.1824 (0.0191)
Same race ( $\alpha_3^m$ )	2.3406 (0.0228)	2.1509 (0.1066)
Partner White ( $\alpha_{41}^m$ )	-1.2006 (0.5004)	-1.1927 (0.5016)
Partner Black ( $\alpha_{42}^m$ )	-4.1403 (0.5066)	-3.8536 (0.5093)
Partner Hispanic ( $\alpha_{43}^m$ )	-2.1641 (0.5026)	-2.0503 (0.5106)
Partner Other ( $\alpha_{44}^m$ )	-0.5040 (0.5193)	-0.9055 (0.5446)

# Results

## Structural model estimates

Preferences	B. Men	C. Women
HW,HW ( $\alpha_{51}^m$ )	-2.0965 (0.3365)	-2.4517 (0.3337)
HW,PT ( $\alpha_{52}^m$ )	-2.9926 (0.3964)	-3.4310 (0.3649)
HW,FT ( $\alpha_{53}^m$ )	-0.5277 (0.3352)	-1.0127 (0.3343)
PT,HW ( $\alpha_{54}^m$ )	-3.2394 (0.4675)	-3.3588 (0.4945)
PT,PT ( $\alpha_{55}^m$ )	-3.2006 (0.5988)	-3.2581 (0.6806)
PT,FT ( $\alpha_{56}^m$ )	-0.9136 (0.3351)	-1.0804 (0.3364)
FT,HW ( $\alpha_{57}^m$ )	-2.2968 (0.3348)	-1.8106 (0.3414)
FT,PT ( $\alpha_{58}^m$ )	-2.7004 (0.3335)	-2.0388 (0.3347)
FT,FT ( $\alpha_{59}^m$ )	-0.0550 (0.3347)	0.4358 (0.3336)

## Conclusion

### To Do list

- Specification of utility function
- Interpretation of results
- Counterfactual analysis

## Model

### Directed search - goods market [Return](#)

- Random search: prices dictate how surplus is shared between buyers and sellers
  - Trading partners meet first and then negotiate prices
- Directed search: Also direct impact on meeting process
  - Sellers establish and publicly declare prices upfront
  - Buyers make informed decisions about which sellers they want to engage with
  - Allow buyers to direct search towards sellers who offer more attractive pricing
- Agents must not only consider terms of trade (i.e., prices), but also probability of trade

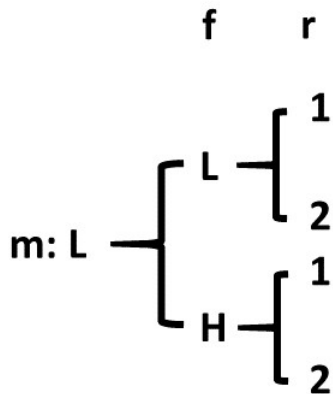
## Transferable utility [◀ Return](#)

- Individuals can "bid" for their favorite partner by lowering own gain obtained from match such that partner can have a higher gain (Chiappori, 2017)
- Only joint gains from matching can be identified
  - Assume gender ratios do have impact on search behavior
  - Not clear in what way utilities are influenced by gender ratios because individuals might make transfers unobserved by econometrician



# Markets

[Return](#)



Descriptive statistics [← Return](#)

Descriptive statistics				
	Mean	SD	MIN	MAX
<b>A. Couples</b>				
Male age	47.59	10.92	25	65
Female age	45.65	10.92	25	65
Male has at least undergraduate degree	0.46	0.50	0	1
Female has at least undergraduate degree	0.52	0.50	0	1
Male work hours	38.24	15.96	0	69
Female work hours	27.68	18.59	0	69
<b>B. Singles</b>				
Male age	47.12	12.05	25	65
Female age	47.72	11.82	25	65
Male has at least undergraduate degree	0.42	0.49	0	1
Female has at least undergraduate degree	0.46	0.50	0	1
Male work hours	33.37	18.77	0	69
Female work hours	29.46	18.44	0	69

Note: Wages are net hourly wages in dollars. Work hours are hours per week.

## Matching distributions [◀ Return](#)

Matching distribution across education

Male education	Female education			
	≤ High school	Associate or Bachelor	Master ≤	Total
≤ High school	37.07	13.60	3.31	53.97
Associate or Bachelor	8.90	16.17	6.05	31.12
Master ≤	2.05	6.21	6.65	14.91
Total	48.01	35.98	16.01	100.00

Note: The sample consists of 2 288 182 couples. The numbers in this table are displayed as percentages.

- +/- 60% same education
- +/- 23% wife higher educated than husband
- +/- 17% husband higher educated than wife

## Matching distributions [◀ Return](#)

Matching distribution across race

Male race	Female race				Total
	White	Black	Hispanic	Other	
White	69.94	0.30	2.56	1.71	74.51
Black	0.80	5.13	0.25	0.11	6.29
Hispanic	2.25	0.10	9.89	0.21	12.46
Other	0.78	0.03	0.15	5.80	6.75
Total	73.76	5.55	12.85	7.84	100.00

Note: The sample consists of 2 288 182 couples. The numbers in this table are displayed as percentages.

- +/- 90% same race

## Matching distributions [◀ Return](#)

Matching distribution across employment status

Male employment	Female employment			
	Unemployed	Part time	Full time	Total
Unemployed	4.31	1.57	5.07	10.95
Part time	1.70	1.69	3.55	6.94
Full time ( $\geq 35$ h)	19.03	15.65	47.43	82.11
Total	25.05	18.91	56.04	100.00

Note: The sample consists of 2 288 182 couples. The numbers in this table are displayed as percentages.

- Majority couples have full time working husband

## Matching distributions [◀ Return](#)

Gender ratios across race and education categories

Gender ratio (+25 years)	MIN	MEAN	MAX
<b>All regions</b>	0.89	0.95	1.09
<b>White</b>			
≤ High school	0.93	1.02	1.27
Associate or Bachelor	0.77	0.88	1.03
Master ≤	0.68	0.89	1.51
<b>Black</b>			
≤ High school	0.80	1.17	2.99
Associate or Bachelor	0.51	1.90	19.63
Master ≤	0.33	0.73	1.70
<b>Hispanic</b>			
≤ High school	0.75	1.10	1.30
Associate or Bachelor	0.48	0.86	1.55
Master ≤	0.39	0.90	1.60
<b>Other</b>			
≤ High school	0.54	1.28	1.51
Associate or Bachelor	0.32	0.43	1.45
Master ≤	0.54	1.22	2.46

Note: The gender ratio is defined as the ratio of total  $m$ -type men over total  $f$ -type women.

- Considerable variation across categories and US states