# The Optimal Assortativity of Teams Inside the Firm

Ashwin Kambhampati (University of Pennsylvania) Carlos Segura-Rodriguez (Banco Central de Costa Rica)

Econometric Society World Congress July 16, 2020

### Motivation

- Teams are a fundamental unit of organization inside many firms.
  - Survey evidence: From 1987 to 1996, share of large firms with  $\geq$  20 percent of workers in problem-solving teams rose from 37 percent to 66 percent (Lawler, Mohrman, and Benson (2001), Lazear and Shaw (2007)).

#### Motivation

- Teams are a fundamental unit of organization inside many firms.
  - Survey evidence: From 1987 to 1996, share of large firms with ≥ 20 percent of workers in problem-solving teams rose from 37 percent to 66 percent (Lawler, Mohrman, and Benson (2001), Lazear and Shaw (2007)).
- Two questions for economic theory:
  - 1. How should a manager form teams?
    - Becker (1973): Complementarities ⇒ positive assortative matching (PAM).
  - 2. How should a manager provide incentives?
    - Holmström (1982): Overcoming free-riding problem under hidden effort.
    - McAfee and McMillan (1991): Extend to include private information.

#### Motivation

- Teams are a fundamental unit of organization inside many firms.
  - Survey evidence: From 1987 to 1996, share of large firms with ≥ 20 percent of workers in problem-solving teams rose from 37 percent to 66 percent (Lawler, Mohrman, and Benson (2001), Lazear and Shaw (2007)).
- Two questions for economic theory:
  - 1. How should a manager form teams?
    - Becker (1973): Complementarities ⇒ positive assortative matching (PAM).
  - 2. How should a manager provide incentives?
    - Holmström (1982): Overcoming free-riding problem under hidden effort.
    - McAfee and McMillan (1991): Extend to include private information.
- Surprisingly little research on intersection.
  - Studying steel production lines Ichniowski, Shaw, and Prennushi (1997) find that clusters of human resources practices have large effects on productivity, while individual practices have little or no effect.

#### What We Do

- Unified analysis of optimal team composition and incentives in presence of both adverse selection and moral hazard.
- Beckerian matching setting in which PAM is full-information optimal.

#### Questions:

- 1. (This Talk) Is PAM profit-maximizing under informational frictions?
- 2. (In Paper) Is delegated matching a profitable alternative?

#### Results

- Complementarity is necessary, but not sufficient, for optimality of PAM.
- If complementarities weak, incentive costs increase in matching assortativity >> rent-efficiency tradeoff ( "disassortative incentives").
- Identify necessary and sufficient conditions for optimality of PAM, random matching (RM), and negative assortative matching (NAM).
- (In Paper) If workers endowed with superior information about one another, might be better to delegate than distort.

#### Literature

- Sorting with Moral Hazard
  - Franco, Mitchell, and Vereschagina (2011)
  - Kaya and Vereschagina (2014)
- Sorting with Adverse Selection
  - Damiano and Li (2007)
  - Johnson (2011)
- Sorting with Moral Hazard and Adverse Selection
  - This Paper

#### Literature

- Sorting with Moral Hazard
  - Franco, Mitchell, and Vereschagina (2011)
  - Kaya and Vereschagina (2014)
- Sorting with Adverse Selection
  - Damiano and Li (2007)
  - Johnson (2011)
- Sorting with Moral Hazard and Adverse Selection
  - This Paper
- Empirical
  - Adhvaryu, Bassi, Nyshadham, and Tamayo (2020) find NAM in Indian garment manufacturer despite estimated complementarities in production function.

# Model

# Environment (1/3)

- Single manager (residual claimant) employs i = 1, ..., N workers,  $N \ge 4$  and even.
- Each worker:
  - Exerts effort at cost c > 0 or shirks at zero cost.
  - IID type t = H with probability p and t = L otherwise.
- Workers protected by limited liability (cannot receive negative wages).
- All parties risk-neutral expected utility maximizers.

# Environment (2/3)

- Binary output produced in pairs.
- No effort by some worker  $\Rightarrow y = 0$  with probability one.
- Effort by both workers  $\Rightarrow y = 1$  with probability determined by types

$$q(t,t') := egin{cases} q_H & ext{if } t = t' = H \ q_M & ext{if } t 
eq t' \ q_L & ext{if } t = t' = L \end{cases}$$
  $0 < q_L < q_M < q_H < 1.$ 

• Notation:  $\mathbf{q} := (q_H, q_M, q_L)$ .

# Environment (3/3)

• Strictly increasing differences

$$q_H - q_M > q_M - q_L$$
.

• Effort in all teams full-information optimal

$$q_L - 2c > 0$$
.

• PAM optimal with moral hazard alone (Franco, Mitchell, and Vereschagina, 2011).

# Contracts, Timing, and Information

Manager commits to contract.

Matching

$$\mu: T^N \to \Delta(\underbrace{\mathcal{P}}_{\mathsf{Pairings}}).$$

Wage scheme

$$w_i: \mathcal{P} \times \mathcal{T}^N \times \mathcal{Y}^{N/2} \to \mathbb{R}_+$$
 for all  $i$ .

- 1. Each worker learns her type and reports it to manager.
- 2. Manager assigns workers to teams.
- 3. Each worker learns teammate type.
- 4. Workers exert effort.
- 5. Manager observes output in all teams and compensates each worker.

## Contracts, Timing, and Information

Manager commits to contract.

Matching

$$\mu: T^N \to \Delta(\underbrace{\mathcal{P}}_{\mathsf{Pairings}}).$$

Wage scheme

$$w_i: \mathcal{P} \times \mathcal{T}^N \times \mathcal{Y}^{N/2} \to \mathbb{R}_+$$
 for all  $i$ .

- 1. Each worker learns her type and reports it to manager.
- 2. Manager assigns workers to teams.
- 3. Each worker learns teammate type.
- 4. Workers exert effort.
- 5. Manager observes output in all teams and compensates each worker.

Simplifying Assumptions for Talk: (1) No participation decisions. (2) Manager considers only contracts that induce effort in all teams.

# **Housekeeping Lemma**

ullet Wlog to consider equal treatment matchings  $\mu$  characterized by parameter

$$p_H^\mu$$
,

interim probability with which worker matches a high given high report.

- If  $p_H^{\mu} = p$ , then  $\mu$  is a random matching (RM).
- If  $p_H^{\mu} > p$ , then  $\mu$  exhibits **positive assortativity** (max  $p_H^{\mu}$  is **PAM**).
- If  $p_H^{\hat{\mu}} < p$ , then  $\mu$  exhibits negative assortativity (min  $p_H^{\hat{\mu}}$  is NAM).
- Wlog to consider *independent and anonymous* wage schemes that depend only on types and output within ones own team.

**Main Results** 

### **Ratios**

#### **Definition**

**q** satisfies decreasing ratios if  $\frac{q_H}{q_M} \leq \frac{q_M}{q_L}$ ; constant ratios if  $\frac{q_H}{q_M} = \frac{q_M}{q_L}$ ; increasing ratios if  $\frac{q_H}{q_M} \geq \frac{q_M}{q_L}$ .

# **Example (Strictly Increasing Differences and Strictly Decreasing Ratios)**

$$q_{H} = \frac{6}{8} \quad q_{M} = \frac{3}{8} \quad q_{L} = \frac{1}{8}$$

$$q_{H} - q_{M} = \frac{3}{8} > \frac{2}{8} = q_{M} - q_{L}$$

$$\frac{q_{H}}{q_{M}} = 2 < 3 = \frac{q_{M}}{q_{L}}.$$

Alternative Terminology: "Log Increasing Differences".

# **Optimal Wages and Information Rents**

# **Theorem 1** (Optimal Wages)

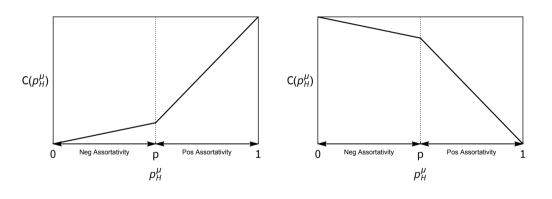
- Suppose  $\mu$  exhibits positive assortativity. If  $\mathbf{q}$  satisfies strictly decreasing ratios, then both types of workers receive a strictly positive information rent at the optimal wage scheme. If  $\mathbf{q}$  satisfies increasing ratios, only highs receive a strictly positive information rent.
- ullet Opposite relationship for  $\mu$  exhibiting negative assortativity.

#### Intuition

- Inducing effort by lows creates incentives for highs to misreport.
- Might think of satisfying truth-telling constraint for highs by distorting allocation to lows, i.e. implement PAM.
- Correct intuition under increasing ratios.
- But, under strictly decreasing ratios, highs prefer to match lows!
- So, to implement PAM, must increase wage payments to highs.
- But then, binding truth-telling constraint for lows forces manager to pay information rent to both types.

## The Problem of Disassortative Incentives

 $C(p_H^{\mu}) :=$  Expected Wage Payments at Optimal Wage Scheme.



(a) Strictly Decreasing Ratios

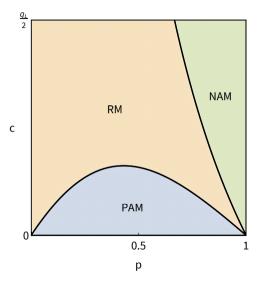
(b) Strictly Increasing Ratios

# **Optimal Matching**

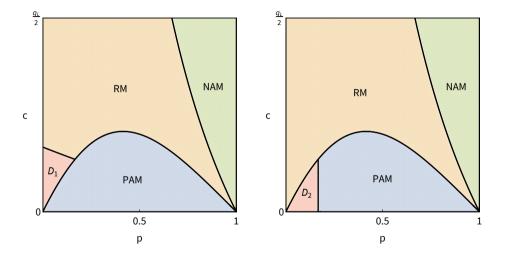
# Theorem 2 (Optimal Matching)

- If q satisfies increasing ratios, then PAM is the unique optimal matching.
- If **q** satisfies strictly decreasing ratios, however, there exist two cutoff values on the cost of effort,  $0 < \underline{c} < \overline{c}$ , such that,
  - 1. PAM is the unique optimal matching if and only if  $c < \underline{c}$ ;
  - 2. RM is the unique optimal matching if and only if  $\underline{c} < c < \overline{c}$ ; and,
  - 3. NAM is the unique optimal matching if and only if  $c > \bar{c}$ .

# **Optimal Matching: Comparative Statics**



# Preview of Results on Delegation



**Final Remarks** 

#### **Final Remarks**

- Identify a new channel by which asymmetric information distorts PAM.
- Result has important empirical implication: Reasonable to expect RM/NAM inside of firms despite technological complementarities.
- In paper: Conditions under which delegation is a profitable alternative.
- Future work: Dynamic optimal matching with information arrival over time.

#### **Final Remarks**

- Identify a new channel by which asymmetric information distorts PAM.
- Result has important empirical implication: Reasonable to expect RM/NAM inside of firms despite technological complementarities.
- In paper: Conditions under which delegation is a profitable alternative.
- Future work: Dynamic optimal matching with information arrival over time.

Thank you!