# Resource Pooling and Staffing in Call Centers with Skill-Based Routing

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Thesis: Performance Modelling and Design of Call Centers with Skill-Based Routing

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# **Resource Pooling for Efficiency**



### How to Understand?

Infinite-Server Models  $(M/G/\infty)$ 

**Offered-Load Models** 

#### Poisson

Normal & Mean = Variance

Square-Root-Staffing Rule

### **Service Differentiation**



From Load-Based Routing Handle Calls PROMPTLY

To Skill-Based Routing Handle Calls PROPERLY

### But keep looking for efficiency



### May get Resource Pooling again!!



### Multiple Types of Calls and Agents



Common case: The service-time distribution does not depend on the call type or the agent.

### **First Contribution:**

### **Demonstrate Resource-Pooling Phenomenon**

A small amount of cross training (multiple skills) produces almost the same performance as if all agents had all skills (as in the single-type case).

**Simulation Experiments** 

### Precedents

"A little bit of flexibility goes a long way."

### Joining One of Many Queues

- Azar, Broder, Karlin and Upfal (1994)
- Vvedenskaya, Dobrushin and Karpelovich (1996)
- Turner (1996, 1998)
- Mitzenmacher (1996) and
- Mitzenmacher and Vöcking (1999) Flexible Manufacturing: Chaining
- Jordan and Graves (1995)
- Aksin and Karaesman (2002)
- Hopp and Van Oyen (2003)
- Jordan, Inman and Blumenfeld (2003)
- Gurumurthi and Benjaafar (2004)

### **An Experiment**

#### Agents are given k skills, $1 \le k \le 6$

#### Three Loads: Normal (84), Light (77.4), Heavy (90)



#### **Second Contribution:**

### **Routing and Provisioning Algorithm**

Minimize the Required Staff and Telephone Lines While Meeting the Service level Agreement (SLA)  $P(Delay \leq 30 \text{ seconds}) \geq 0.80$  $P(Blocking) \leq 0.005$ (service level may depend on call type)

# Give each agent TWO Skills

### **Use Static Priorities**

# **Determining Primary Skills**

$$C_k = \alpha_k + x_{\sqrt{\alpha_k}}$$

$$x = \frac{(C - \alpha)}{\sum_{i=1}^{n} \sqrt{\alpha_i}}$$

#### and round

# **Determining Secondary Skills**

 $C_{i,k} = \frac{C_i C_k}{C - C_i}$ 

### and round

# **Perform Local Search**

**Using Simulation** 

# **Performance?**

**Remarkable!** 

