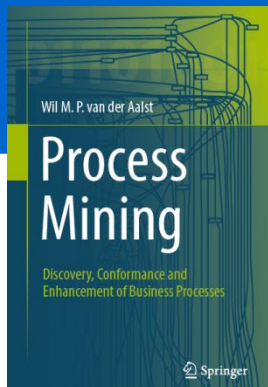


Process Mining: Data Science in Action

Organizational Mining

prof.dr.ir. Wil van der Aalst
www.processmining.org

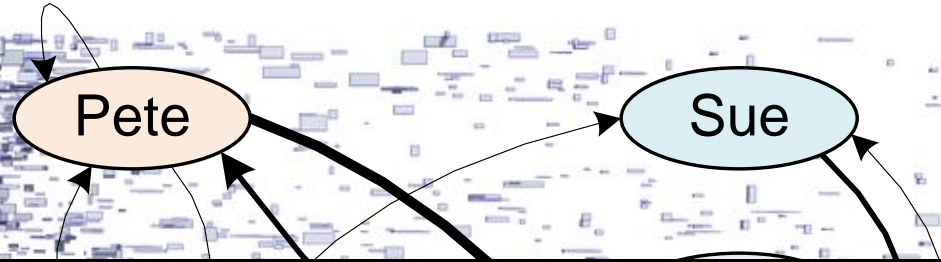


TU/e

Technische Universiteit
Eindhoven
University of Technology

Where innovation starts

Previous lecture:
Social network analysis



**How to automatically add the
organizational/resource perspective
to process models using event data?**



Resource-activity matrix

(see previous lecture)

case id trace

1 $\langle a^{Pete}, b^{Sue}, d^{Mike}, e^{Sara}, h^{Pete} \rangle$
2 $\langle a^{Mike}, d^{Mike}, c^{Pete}, e^{Sara}, g^{Ellen} \rangle$
3 $\langle a^{Pete}, c^{Mike}, d^{Ellen}, e^{Sara}, f^{Sara}, b^{Sean}, d^{Pete} \rangle$
4 $\langle a^{Pete}, b^{Mike}, c^{Sara}, d^{Sara}, g^{Ellen} \rangle$

Mean number of times a resource performs an activity per case.

	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>	<i>f</i>	<i>g</i>	<i>h</i>
5 Pete	0.3	0	0.345	0.69	0	0	0.135	0.165
6 Mike	0.5	0	0.575	1.15	0	0	0.225	0.275
.. Ellen	0.2	0	0.23	0.46	0	0	0.09	0.11
Sue	0	0.46	0	0	0	0	0	0
Sean	0	0.69	0	0	0	0	0	0
Sara	0	0	0	0	2.3	1.3	0	0

Question: Which resources are similar?

	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>	<i>f</i>	<i>g</i>	<i>h</i>
Pete	0.3	0	0.345	0.69	0	0	0.135	0.165
Mike	0.5	0	0.575	1.15	0	0	0.225	0.275
Ellen	0.2	0	0.23	0.46	0	0	0.09	0.11
Sue	0	0.46	0	0	0	0	0	0
Sean	0	0.69	0	0	0	0	0	0
Sara	0	0	0	0	2.3	1.3	0	0

Suppose that you need to make three groups with similar resources. What would these groups be?

Answer

	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>	<i>f</i>	<i>g</i>	<i>h</i>
Pete	0.3	0	0.345	0.69	0	0	0.135	0.165
Mike	0.5	0	0.575	1.15	0	0	0.225	0.275
Ellen	0.2	0	0.23	0.46	0	0	0.09	0.11
Sue	0	0.46	0	0	0	0	0	0
Sean	0	0.69	0	0	0	0	0	0
Sara	0	0	0	0	2.3	1.3	0	0

{ Pete, Mike, Ellen }

{ Sue, Sean }

{ Sara }

Distance based on resource-activity matrix

Standard notions of "distance" can be used e.g., Euclidian distance, Manhattan distance, Minkowski distance, and Pearson's correlation coefficient.

$$P_{Pete} = (0.3 , 0 , 0.345 , 0.69 , 0 , 0 , 0.135 , 0.165)$$

$$P_{Mike} = (0.5 , 0 , 0.575 , 1.15 , 0 , 0 , 0.225 , 0.275)$$

$$P_{Sara} = (0 , 0 , 0 , 0 , 2.3 , 1.3 , 0 , 0)$$

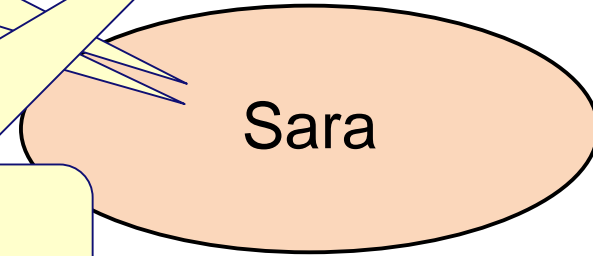
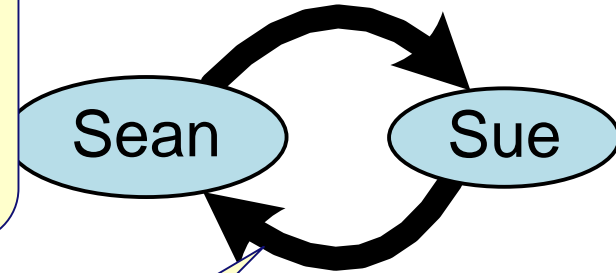
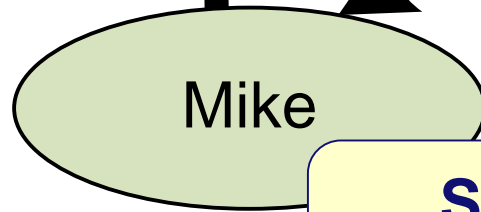
Social network based on similarity of profiles

Resources
similarity
actions

resources
and
is

Self-loops are suppressed as they contain no information (self-similarity).

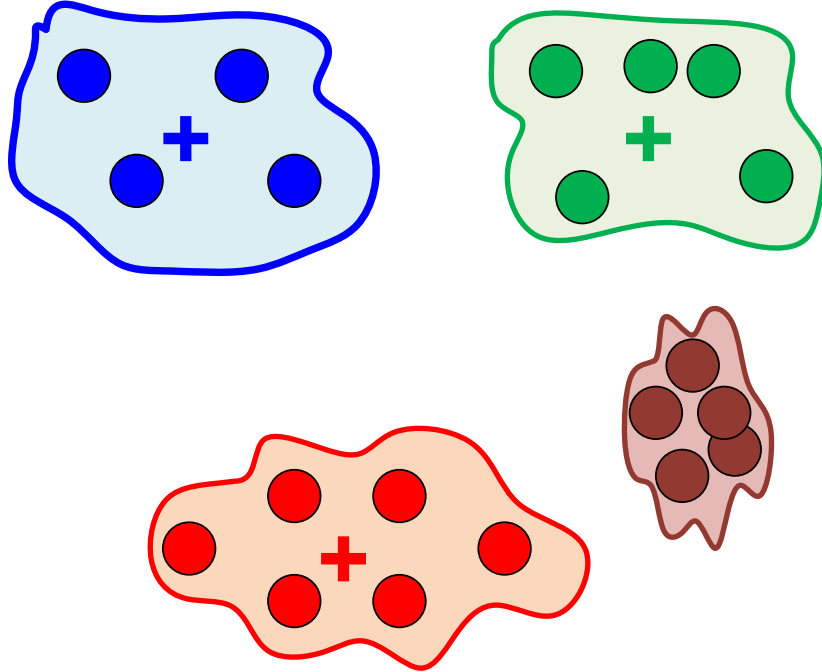
other resources.



Similarity is the inverse of distance.

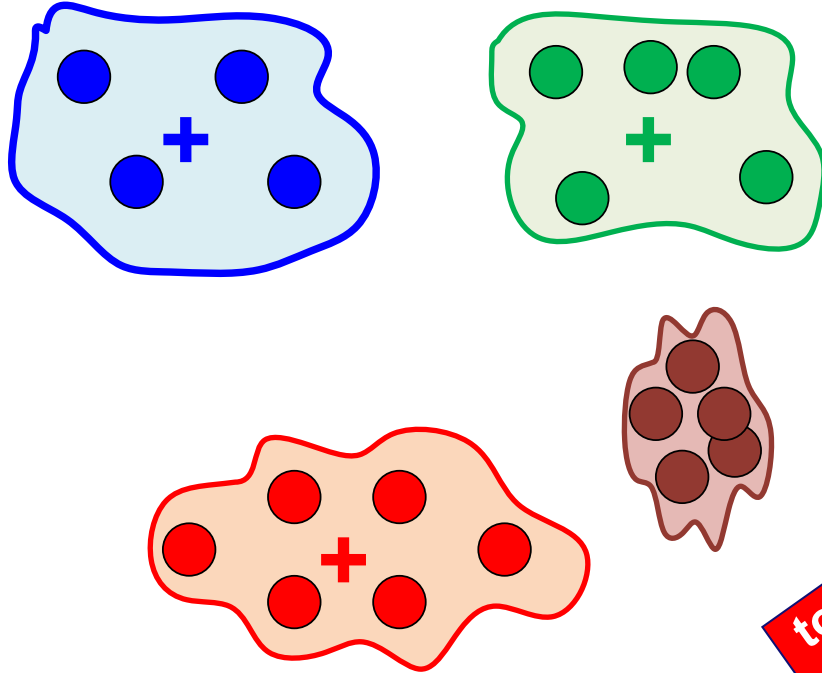
Related to clustering

(basic data mining technique discussed before)



- ***k*-means clustering**
- **agglomerative hierarchical clustering**

Clustering: cases and resources



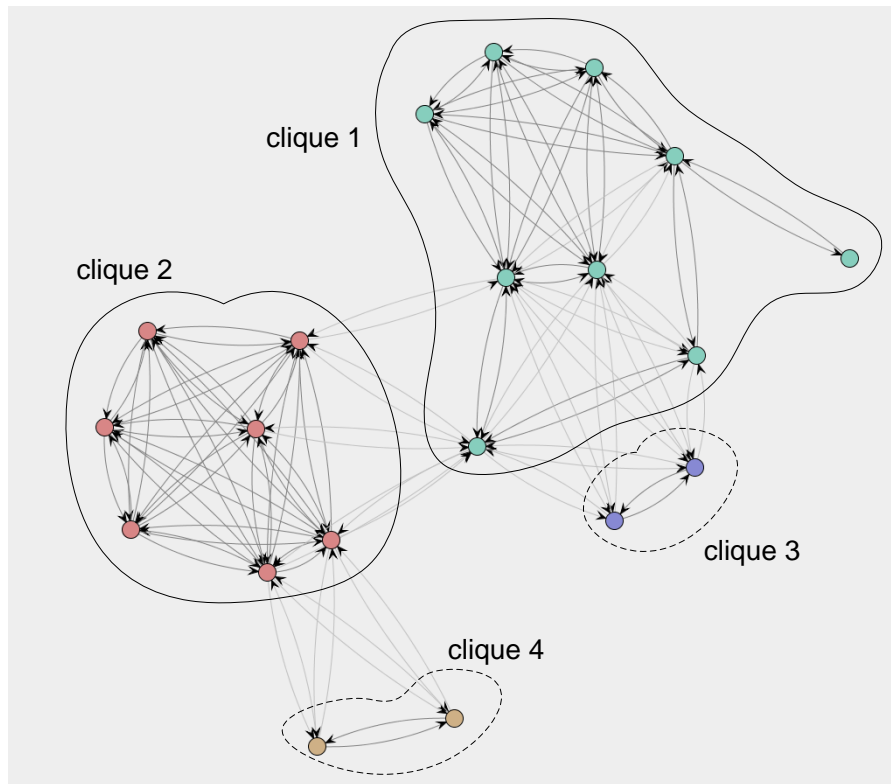
Clustering may be used for:

- grouping **cases** (process variants)
- grouping **resources** (identifying roles)

Real-life example: Roles found by ProM

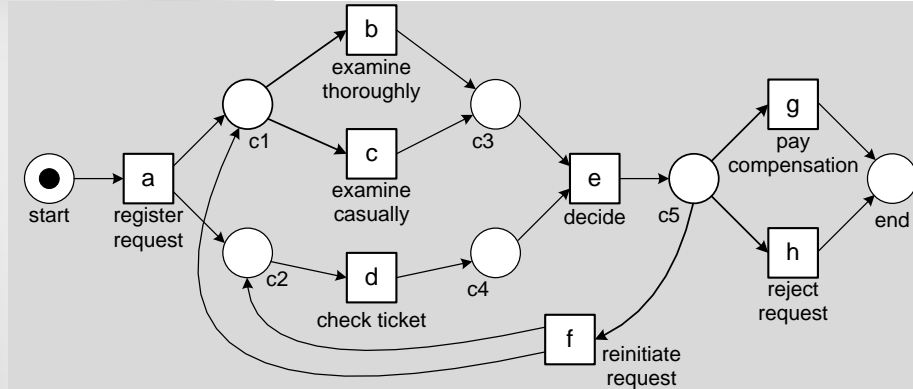
user	a_1	a_2	a_3	a_4	a_5	a_6	a_7	a_8	a_9	a_{10}	a_{11}	a_{12}	a_{13}
user 1	0	0	51	0	0	0	0	0	0	0	0	0	0
user 2	1	2	0	0	2	0	0	0	0	38	0	69	0
user 3	0	9	0	0	0	0	0	0	0	0	0	0	0
user 4	2	0	0	0	0	0	0	0	0	0	0	0	0
user 5	117	0	4	0	3	0	0	0	0	1	0	20	6
user 6	172	6	14	0	7	3	0	0	1	2	0	48	53
user 7	1	41	8	14	275	8	8	865	55	180	0	128	5
user 8	2	868	7	6	105	0	0	79	266	441	0	844	3
user 9	90	0	2	0	1	2	0	0	1	2	0	27	28
user 10	0	0	0	899	0	0	0	0	0	0	0	0	1019
user 11	336	1	3	1	4	2	0	0	0	1	0	18	23
user 12	1	645	13	21	419	3	0	3	217	281	1	334	9
user 13	0	1	0	0	0	0	0	0	0	0	0	0	0
user 14	0	0	0	0	0	0	0	0	0	1	0	0	0
user 15	0	0	0	0	0	0	0	2	2	0	0	2	0
user 16	1	3	3	2	1	0	0	1	2	3	1	0	0
user 17	0	4	0	0	0	0	0	0	0	0	0	0	0
user 18	9	0	0	0	0	0	0	0	0	0	0	0	0
user 19	13	1	0	0	1	0	0	0	0	0	0	4	0
user 20	0	0	0	21	0	0	0	0	0	0	0	0	258

(not normalized per case)

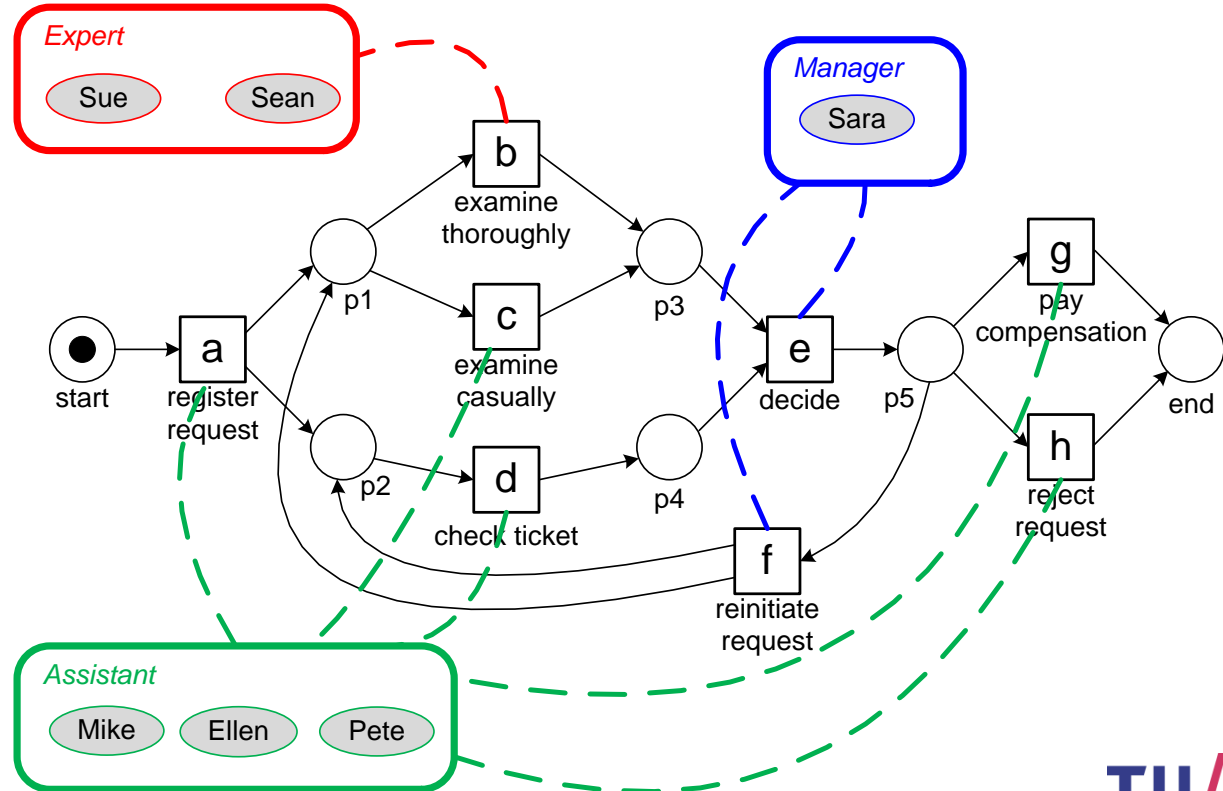
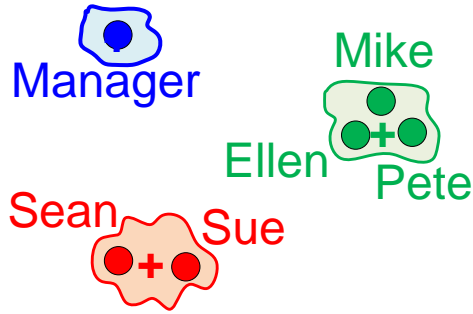




**assign activities
to roles, groups,
or other
organizational
entities**



Extending process models with the organizational perspective

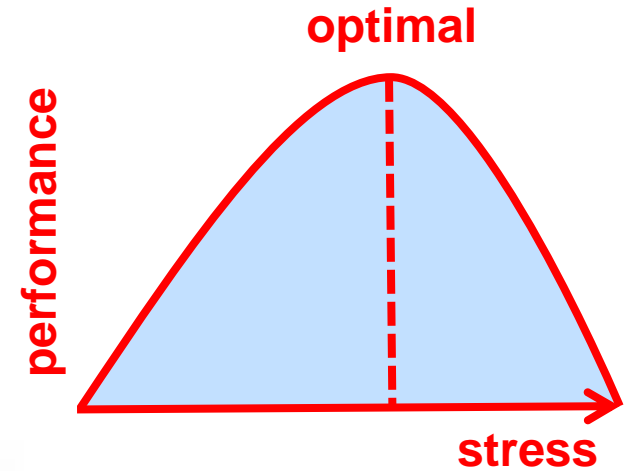


Learning more about resources

- When are resources **available**?
 - part-time, vacation, illness, ...
 - shared among different processes
- Which resources **collaborate** well?
- Which resources perform well on **specific activities**?
- ...



Yerkes-Dodson law of arousal



All-inclusive process models are needed ...

Processes, people, roles, and other organizational entities are intertwined and cannot be viewed in isolation.



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Introduction

Chapter 2
Process Modeling and
Analysis

Chapter 3
Data Mining

Part II: From Event Logs to Process Models

Chapter 4
Getting the Data

Chapter 5
Process Discovery: An
Introduction

Chapter 6
Advanced Process
Discovery Techniques

Part III: Beyond Process Discovery

Chapter 7
Conformance
Checking

Chapter 8
Mining Additional
Perspectives

Chapter 9
Operational Support

Part IV: Putting Process Mining to Work

Chapter 10
Tool Support

Chapter 11
Analyzing “Lasagna
Processes”

Chapter 12
Analyzing “Spaghetti
Processes”

Part V: Reflection

Chapter 13
Cartography and
Navigation

Chapter 14
Epilogue

