



# Why emotional behaviors matter for the design of decision support systems (DSSs)

Evidence from text-based electronic  
negotiations

Work presented at the 20th Conference of the International Federation  
of Operational Research Societies in Barcelona, Spain. 14.07.2014

# Motivation

Focus: Behavioral issues connected to decision support (e.g., Hämäläinen et al., 2013)

**Emotions** are **important** to consider in **negotiations** and should be when developing negotiation support systems, since these impact negotiation effectiveness (Broekens et al., 2010; Hindriks & Jonker, 2008)

- Research should focus more on how decision or negotiation **support** affects **interactions** between the negotiators (Kersten & Lai, 2007; Turel et al., 2007; Weigand et al., 2003)
- Unfortunately, the impact of DSSs on emotional behavior and specifically emotional dynamics **lacks** empirical **attention** (Bui, 1994; Lim & Benbasat, 1992-93; Pommeranz et al., 2009)

# Motivation

Focus: Behavioral issues connected to decision support (e.g., Hämäläinen et al., 2013)

**Emotions** are **important** to consider in **negotiations** and should be when developing negotiation support systems, since these impact negotiation effectiveness (Broekens et al., 2010; Hindriks & Jonker, 2008)

- Research should focus more on how decision or negotiation **support** affects **interactions** between the negotiators (Kersten & Lai, 2007; Turel et al., 2007; Weigand et al., 2003)
- Unfortunately, the impact of DSSs on emotional behavior and specifically emotional dynamics **lacks** empirical **attention** (Bui, 1994; Lim & Benbasat, 1992-93; Pommeranz et al., 2009)

## The **impact of decision support** on the **dynamics of emotional expressions in text-based online negotiations**

Main contributions:

- DSSs impact emotional expressions in and throughout text-based online negotiations (initial evidence)
- Incorporating affective behavior is important when designing DSSs (supplementary evidence to Broekens et al., 2010)

# Theoretical & Methodological Introduction

## Emotional Expressions

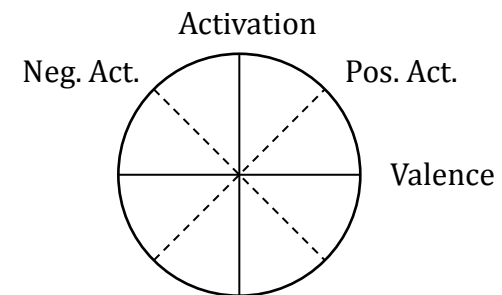
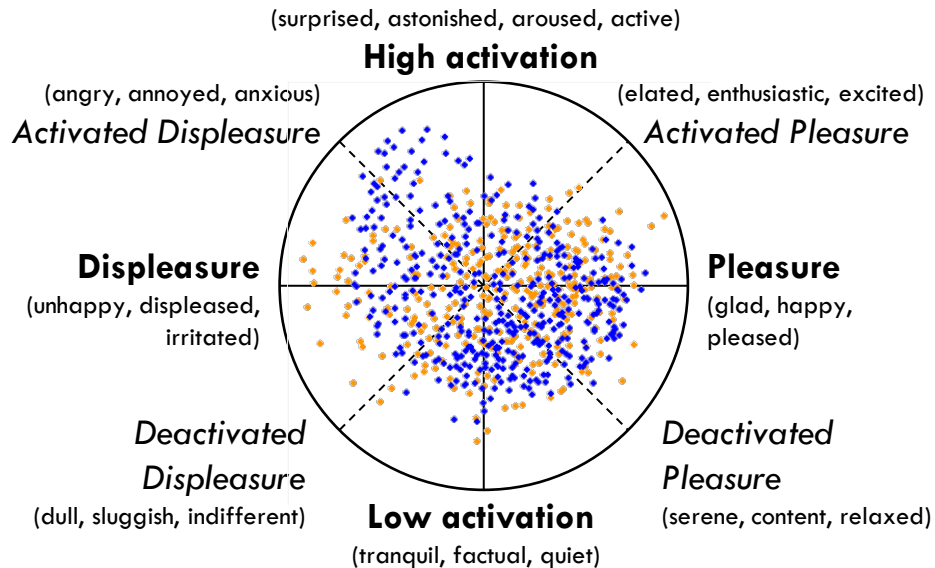
- Theoretical foundation
  - Dimensional perspective of affect (Russell, 1980; Watson & Tellegen, 1985; Yik et al., 1999)
- Methodological foundation
  - Multidimensional scaling based on similarity judgments (e.g. Borg & Groenen, 2005; Lawless et al., 1995)

## Temporal dynamics

- Theoretical foundation
  - Phase model theories of negotiations (e.g. Adair & Brett, 2005; Holmes, 1992; Weingart & Olekalns, 2004)
- Methodological foundation
  - Data driven identification of phase split-points (Koeszegi et al., 2011; Vetschera, 2013)

## Behavioral dynamics

- Theoretical foundation
  - Multilevel framework: (a) Dyadic, (b) intra-personal, (c) inter-personal level
- Methodological foundation
  - Multilevel modeling: Actor-partner interdependence model (e.g. Kenny et al., 2006)



# Theoretical & Methodological Introduction

## Emotional Expressions

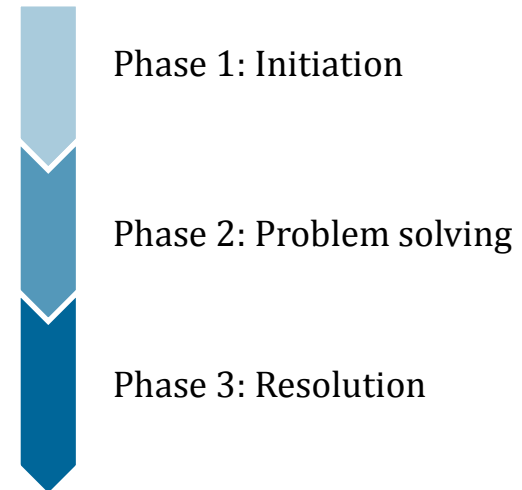
- Theoretical foundation
  - Dimensional perspective of affect (Russell, 1980; Watson & Tellegen, 1985; Yik et al., 1999)
- Methodological foundation
  - Multidimensional scaling based on similarity judgments (e.g. Borg & Groenen, 2005; Lawless et al., 1995)

## Temporal dynamics

- Theoretical foundation
  - Phase model theories of negotiations (e.g. Adair & Brett, 2005; Holmes, 1992; Weingart & Olekalns, 2004)
- Methodological foundation
  - Data driven identification of phase split-points (Koeszegi et al., 2011; Vetschera, 2013)

## Behavioral dynamics

- Theoretical foundation
  - Multilevel framework: (a) Dyadic, (b) intra-personal, (c) inter-personal level
- Methodological foundation
  - Multilevel modeling: Actor-partner interdependence model (e.g. Kenny et al., 2006)



# Theoretical & Methodological Introduction

## Emotional Expressions

- Theoretical foundation
  - Dimensional perspective of affect (Russell, 1980; Watson & Tellegen, 1985; Yik et al., 1999)
- Methodological foundation
  - Multidimensional scaling based on similarity judgments (e.g. Borg & Groenen, 2005; Lawless et al., 1995)

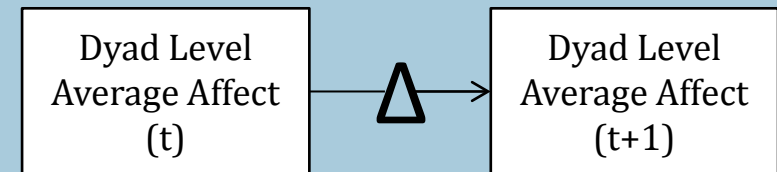
## Temporal dynamics

- Theoretical foundation
  - Phase model theories of negotiations (e.g. Adair & Brett, 2005; Holmes, 1992; Weingart & Olekalns, 2004)
- Methodological foundation
  - Data driven identification of phase split-points (Koeszegi et al., 2011; Vetschera, 2013)

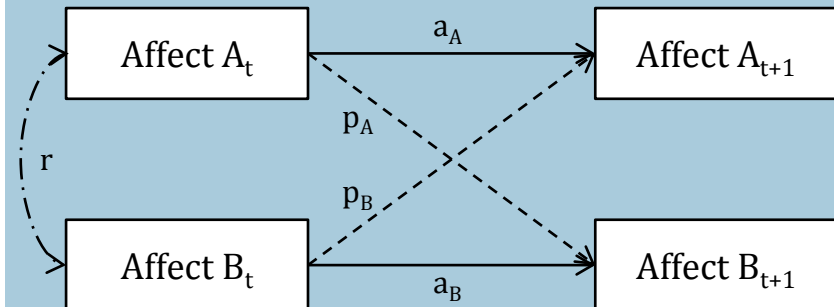
## Behavioral dynamics

- Theoretical foundation
  - Multilevel framework: (a) Collective, (b) intra-personal, (c) inter-personal level
- Methodological foundation
  - Mostly multilevel modeling: Actor-partner interdependence model (e.g. Kenny et al., 2006)

### (a) Collective Level

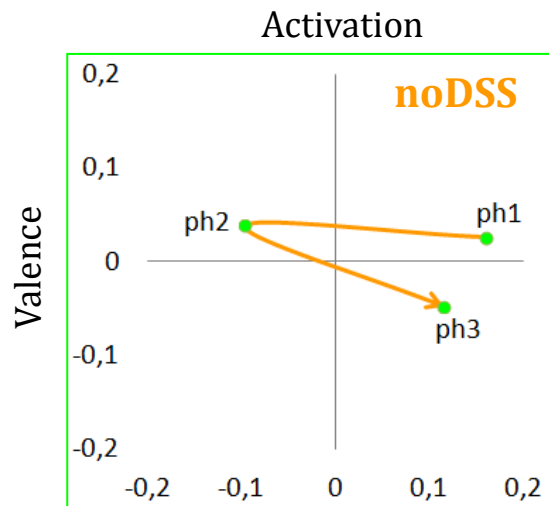
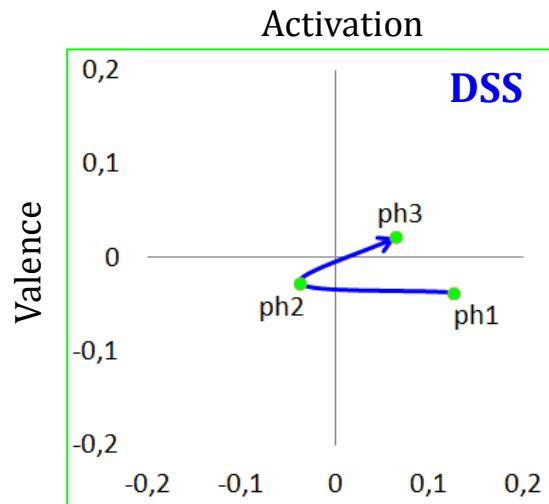


### (b+c) Intra- and Inter-Personal Level



- r ... Intra-phase reciprocity of affective expression
- p ... Inter-personal influence of affective expressions
- a ... Intra-personal influence of affective expressions

# Results: Impact of a DSS in Successful negotiations (dyadic level)



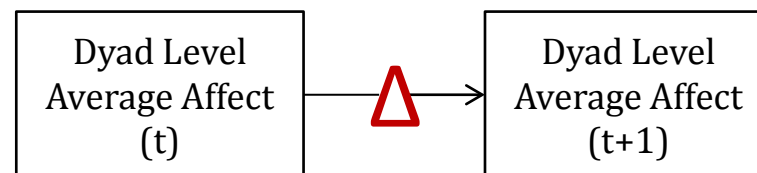
**Table 1. Between phase comparisons: Successful (t-tests)**

	Positive Activation	
	DSS	noDSS
Ph1 vs. Ph2	3.105 (.009) ***	3.235 (.015) **
Ph2 vs. Ph3	-3.546 (.006) ***	-1.392 (.198)
Ph1 vs. Ph3	0.019 (.985)	1.342 (.198)

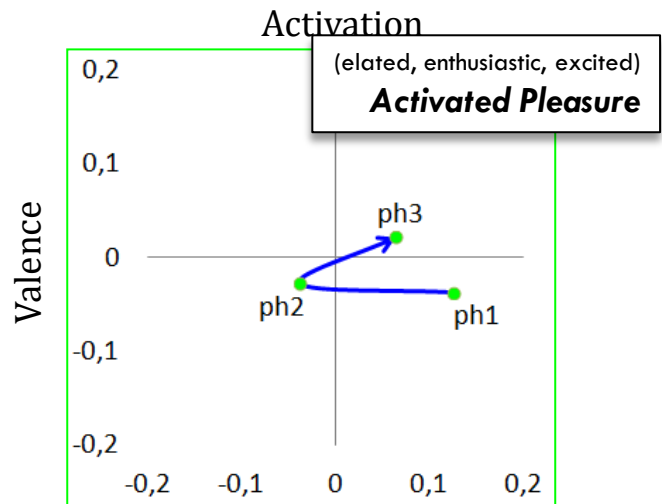
  

	Negative Activation	
	DSS	noDSS
Ph1 vs. Ph2	-2,374 (.084)*	-3.862 (.003) ***
Ph2 vs. Ph3	0.839 (.411)	3.651 (.003) ***
Ph1 vs. Ph3	-1.667 (.167)	0.342 (.737)

\* p < .10; \*\* p < .05; \*\*\* p < .01 | p-values adjusted using false discovery rate (FDR)



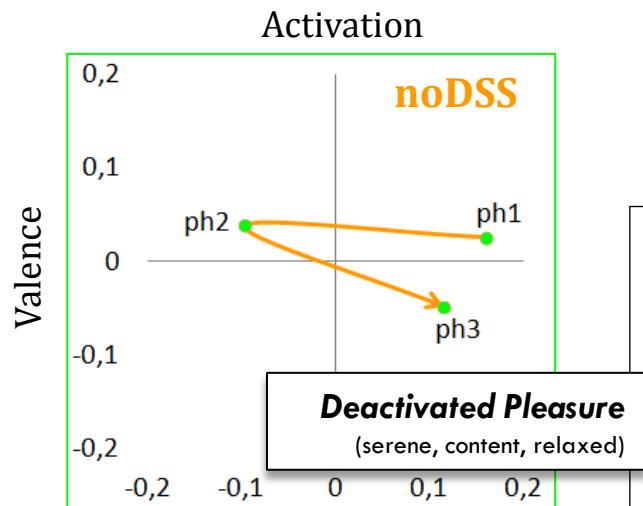
# Results: Impact of a DSS in Successful negotiations (dyadic level)



**Table 1. Between phase comparisons: Successful (t-tests)**

	Positive Activation	
	DSS	noDSS
Ph1 vs. Ph2	3.105 (.009) ***	3.235 (.015) **
Ph2 vs. Ph3	-3.546 (.006) ***	-1.392 (.198)
Ph1 vs. Ph3	0.019 (.985)	1.342 (.198)
Negative Activation		
	DSS	noDSS
Ph1 vs. Ph2	-2,374 (.084)*	-3.862 (.003) ***
Ph2 vs. Ph3	0.839 (.411)	3.651 (.003) ***
Ph1 vs. Ph3	-1.667 (.167)	0.342 (.737)

\* p < .10; \*\* p < .05; \*\*\* p < .01 | p-values adjusted using false discovery rate (FDR)

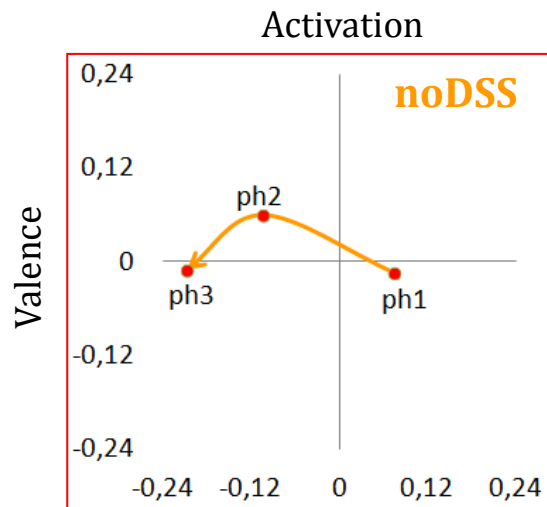
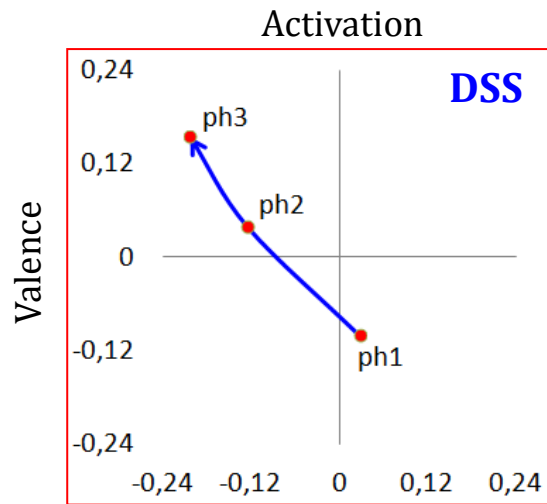


In successful negotiations pleasure increases from ph2 to ph3:

- **DSS**: towards activated pleasure (e.g. elated, excited)
- **noDSS**: towards deactivated pleasure (e.g. content, at ease)



# Results: Impact of a DSS in Failed negotiations (dyadic level)



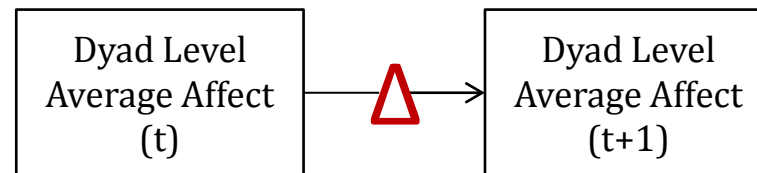
**Table 2. Between phase comparisons: Failed (t-tests)**

	Valence	
	DSS	noDSS
Ph1 vs. Ph2	2.854 (.026) **	2.932 (.036) **
Ph2 vs. Ph3	1.118 (.290)	1.844 (.108)
Ph1 vs. Ph3	4.116 (.006) ***	2.866 (.036) **

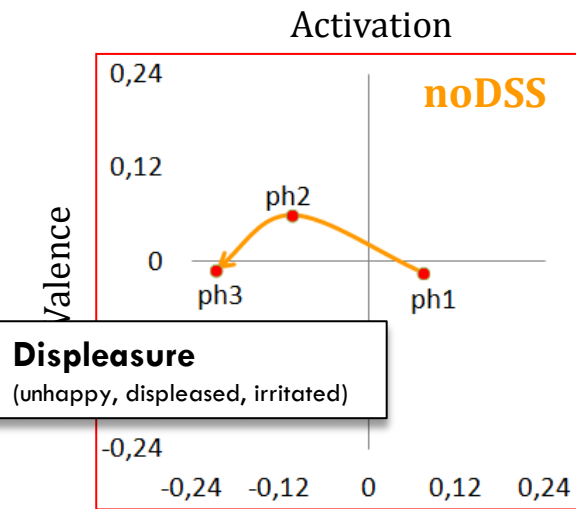
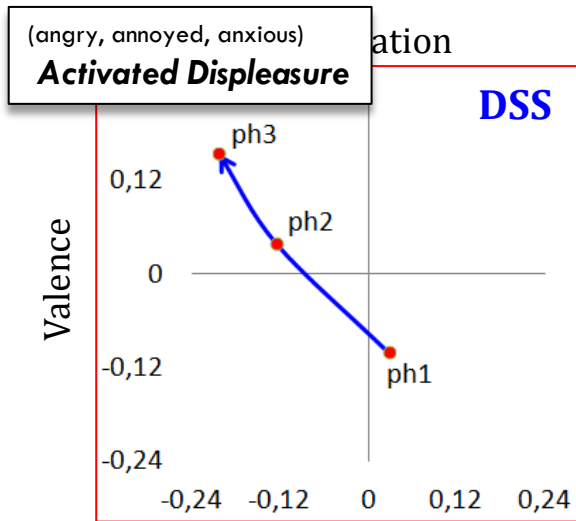
  

	Activation	
	DSS	noDSS
Ph1 vs. Ph2	-2,328 (.063)*	-0.834 (.662)
Ph2 vs. Ph3	-1.866 (.092) *	0.816 (.662)
Ph1 vs. Ph3	-4.613 (.003) ***	-0.036 (.972)

\* p < .10; \*\* p < .05; \*\*\* p < .01 | p-values adjusted using false discovery rate (FDR)



# Results: Impact of a DSS in Failed negotiations (dyadic level)



**Table 2. Between phase comparisons: Failed (t-tests)**

	Valence	
	DSS	noDSS
Ph1 vs. Ph2	2.854 (.026) **	2.932 (.036) **
Ph2 vs. Ph3	1.118 (.290)	1.844 (.108)
Ph1 vs. Ph3	4.116 (.006) ***	2.866 (.036) **

	Activation	
	DSS	noDSS
Ph1 vs. Ph2	-2,328 (.063)*	-0.834 (.662)
Ph2 vs. Ph3	-1.866 (.092) *	0.816 (.662)
Ph1 vs. Ph3	-4.613 (.003) ***	-0.036 (.972)

\* p < .10; \*\* p < .05; \*\*\* p < .01 | p-values adjusted using false discovery rate (FDR)

In failed negotiations displeasure increases over time:

- **DSS**: towards activated displeasure (e.g. angry, anxious)
- **noDSS**: towards displeasure (e.g. displeased, unhappy)

Final CI is significantly (t=-2.144) lower ( $\Delta$ =-0.0903) with DSS

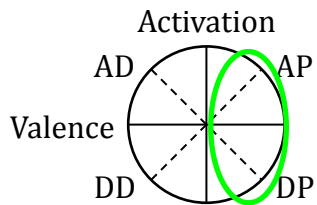
# Results: Reciprocation of Affective Behaviors within Phases

**Table 3. ICCs (Intraclass Correlation Coefficients)**

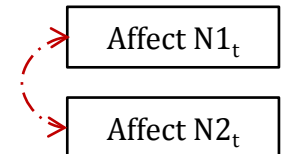
	Phase 1		Phase 2		Phase 3	
	Valence	Activation	Valence	Activation	Valence	Activation
Successful (DSS)	.428 **	-.335 *	.367 *	.160	.024	.436 **
Successful (noDSS)	.170	.149	.285	.374 *	.661 ***	.277
Failed (DSS)	.299	-.332	-.263	.169	.344	-.053
Failed (noDSS)	-.163	-.023	.321	.410	-.034	.342
	AP/DD	AD/DP	AP/DD	AD/DP	AP/DD	AD/DP
Successful (DSS)	.001	.229	.138	.365 *	.578 ***	.083
Successful (noDSS)	.133	.205	.203	.395 *	.546 ***	.466 **
Failed (DSS)	.141	-.059	.218	-.050	.292	-.000
Failed (noDSS)	-.125	-.071	.159	.483 *	-.065	.282

\* p < .10; \*\* p < .05; \*\*\* p < .01

AP/DD (Activated Pleasure vs. Deactivated Displeasure); AD/DP (Activated Displeasure vs. Deactivated Pleasure)



Phase 3 (noDSS)



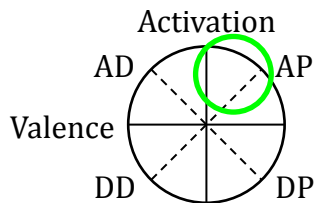
# Results: Reciprocation of Affective Behaviors within Phases

**Table 3. ICCs (Intraclass Correlation Coefficients)**

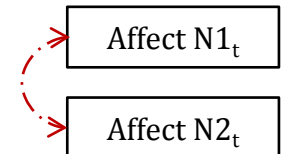
	Phase 1		Phase 2		Phase 3	
	Valence	Activation	Valence	Activation	Valence	Activation
Successful (DSS)	.428 **	-.335 *	.367 *	.160	.024	.436 **
Successful (noDSS)	.170	.149	.285	.374 *	.661 ***	.277
Failed (DSS)	.299	-.332	-.263	.169	.344	-.053
Failed (noDSS)	-.163	-.023	.321	.410	-.034	.342
	AP/DD	AD/DP	AP/DD	AD/DP	AP/DD	AD/DP
Successful (DSS)	.001	.229	.138	.365 *	.578 ***	.083
Successful (noDSS)	.133	.205	.203	.395 *	.546 ***	.466 **
Failed (DSS)	.141	-.059	.218	-.050	.292	-.000
Failed (noDSS)	-.125	-.071	.159	.483 *	-.065	.282

\* p < .10; \*\* p < .05; \*\*\* p < .01

AP/DD (Activated Pleasure vs. Deactivated Displeasure); AD/DP (Activated Displeasure vs. Deactivated Pleasure)



Phase 3 (DSS)



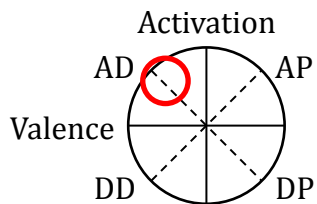
# Results: Reciprocation of Affective Behaviors within Phases

**Table 3. ICCs (Intraclass Correlation Coefficients)**

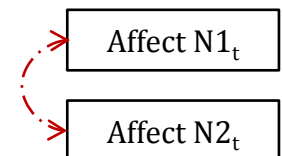
	Phase 1		Phase 2		Phase 3	
	Valence	Activation	Valence	Activation	Valence	Activation
Successful (DSS)	.428 **	-.335 *	.367 *	.160	.024	.436 **
Successful (noDSS)	.170	.149	.285	.374 *	.661 ***	.277
Failed (DSS)	.299	-.332	-.263	.169	.344	-.053
Failed (noDSS)	-.163	-.023	.321	.410	-.034	.342
	AP/DD	AD/DP	AP/DD	AD/DP	AP/DD	AD/DP
Successful (DSS)	.001	.229	.138	.365 *	.578 ***	.083
Successful (noDSS)	.133	.205	.203	.395 *	.546 ***	.466 **
Failed (DSS)	.141	-.059	.218	-.050	.292	-.000
Failed (noDSS)	-.125	-.071	.159	.483 *	-.065	.282

\* p < .10; \*\* p < .05; \*\*\* p < .01

AP/DD (Activated Pleasure vs. Deactivated Displeasure); AD/DP (Activated Displeasure vs. Deactivated Pleasure)



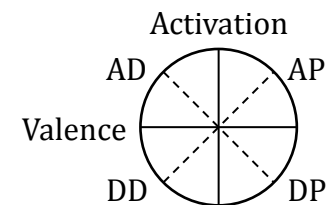
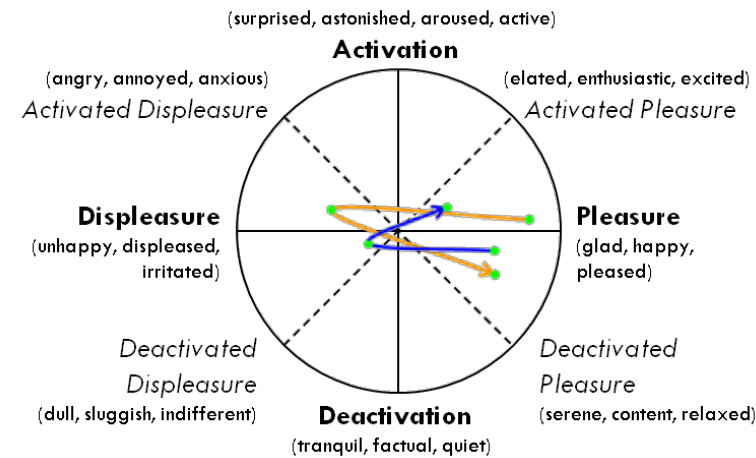
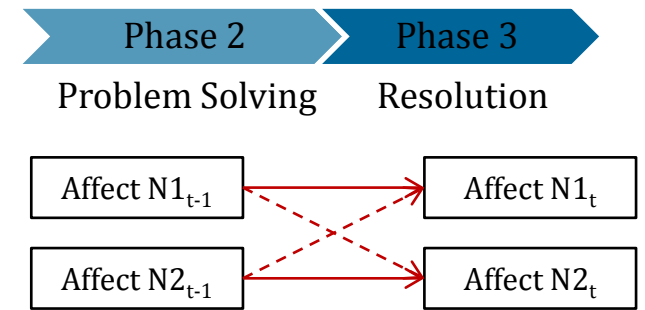
Phase 2 (noDSS)



# Results: Actor and Partner Effects of Affective Behaviors between Phases – Successful Negotiations

**Table 4. APIMs (Actor-Partner Interdependence Models)**

	Valence (phase 3)		Activation (phase 3)	
	Model 1	Model 2	Model 3	Model 4
Predictors (phase 2)	DSS	noDSS	DSS	noDSS
Intercept	0.001	0.301 **	-0.035	0.001
c_CI (actor)	0.164	-0.460	0.062	-0.172
c_CI (partner)	0.045	-0.261	0.204	-0.056
Valence (actor)	0.378 **	-0.004	0.038	0.046
Valence (partner)	-0.025	0.058	0.235	-0.169
Activation (actor)	-0.026	0.070	0.293	0.313
Activation (partner)	-0.150	-0.003	0.252	-0.196
Pseudo R <sup>2</sup>	0.188	0.135	0.146	0.118
	AP/DD (phase 3)		AD/DP (phase 3)	
	Model 5	Model 6	Model 7	Model 8
Predictors (phase 2)	DSS	noDSS	DSS	noDSS
Intercept	-0.024	0.213	-0.025	-0.212 *
c_CI (actor)	0.159	-0.448	-0.075	0.205
c_CI (partner)	0.178	-0.225	0.110	0.143
AP/DD (actor)	0.341 **	0.207	-0.011	0.146
AP/DD (partner)	0.160	-0.160	0.329	-0.214
AD/DP (actor)	-0.075	0.167	0.331 *	0.097
AD/DP (partner)	-0.056	-0.046	0.067	0.015
Pseudo R <sup>2</sup>	0.316	0.142	0.108	0.107

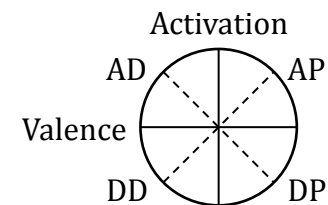
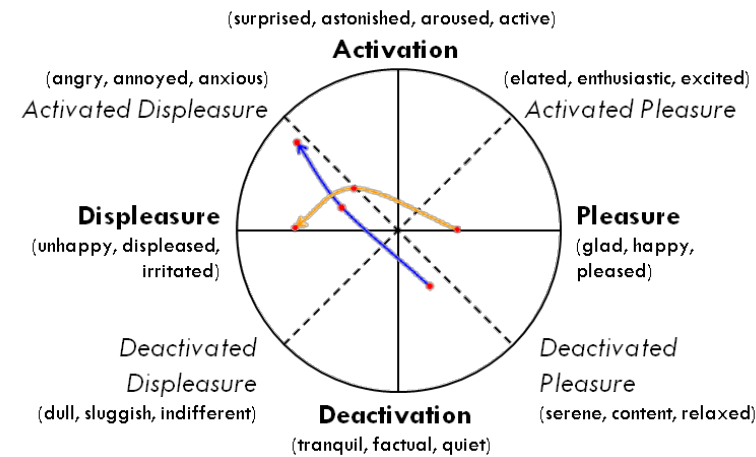
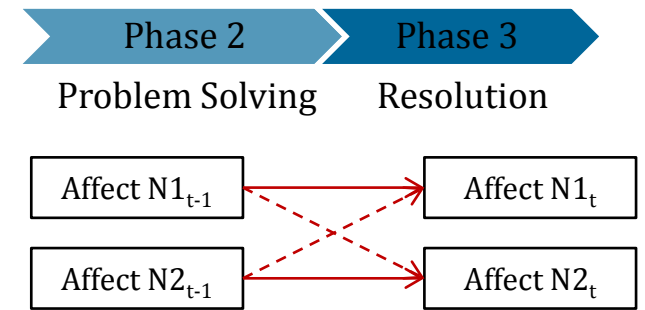


\*\*\* p<.01; \*\* p<.05; \* p<.10

# Results: Actor and Partner Effects of Affective Behaviors between Phases – Successful Negotiations

**Table 5. APIMs (Actor-Partner Interdependence Models)**

	Valence (phase 3)		Activation (phase 3)	
	Model 9	Model 10	Model 11	Model 12
Predictors (phase 2)	DSS	noDSS	DSS	noDSS
Intercept	-0.060	-0.346	0.182	0.035
c_CI (actor)	-0.190	0.580	0.001	0.053
c_CI (partner)	-0.149	0.326	-0.095	-0.076
Valence (actor)	0.480 *	0.616	-0.419	0.614 *
Valence (partner)	-0.032	0.120	0.639 **	0.040
Activation (actor)	0.314 *	-0.266	-0.010	0.013
Activation (partner)	0.355 **	-0.636	0.499 **	0.339
Pseudo R <sup>2</sup>	0.362	0.284	0.373	0.213
	AP/DD (phase 3)		AD/DP (phase 3)	
	Model 13	Model 14	Model 15	Model 16
Predictors (phase 2)	DSS	noDSS	DSS	noDSS
Intercept	0.089	-0.211	0.170	0.279
c_CI (actor)	-0.132	0.429	0.137	-0.391
c_CI (partner)	-0.172	0.163	0.041	-0.302
AP/DD (actor)	0.176	0.498	-0.611 *	0.155
AP/DD (partner)	0.739 ***	-0.048	0.393	0.467
AD/DP (actor)	0.124	-0.734 *	0.296	0.152
AD/DP (partner)	0.107	-0.218	-0.271	0.534
Pseudo R <sup>2</sup>	0.479	0.443	0.286	0.092

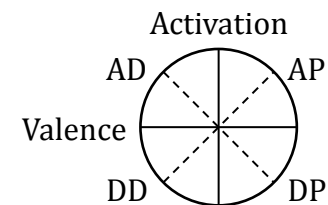
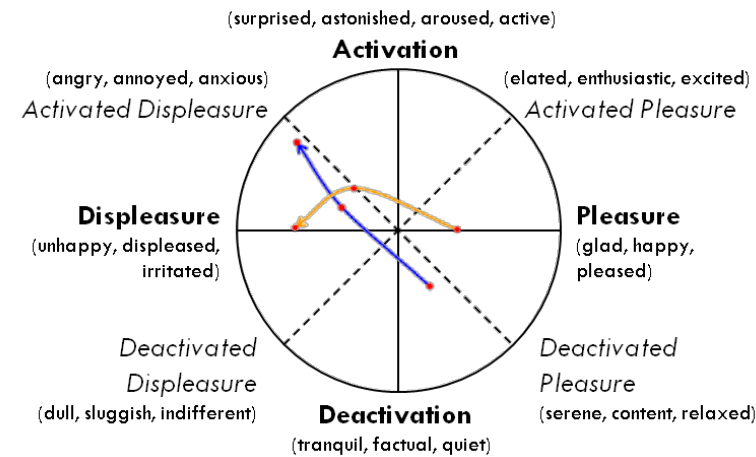
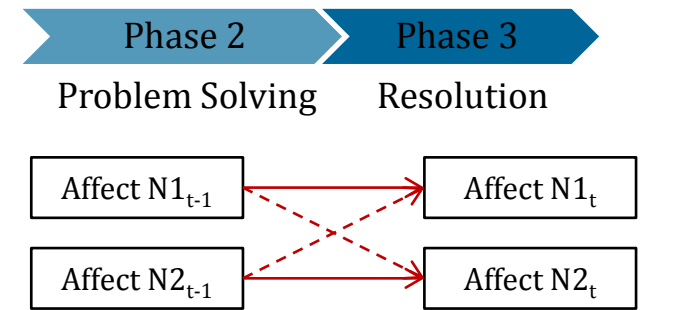


\*\*\* p<.01; \*\* p<.05; \* p<.10

# Results: Actor and Partner Effects of Affective Behaviors between Phases – Successful Negotiations

**Table 5. APIMs (Actor-Partner Interdependence Models)**

	Valence (phase 3)		Activation (phase 3)	
	Model 9	Model 10	Model 11	Model 12
Predictors (phase 2)	DSS	noDSS	DSS	noDSS
Intercept	-0.060	-0.346	0.182	0.035
c_CI (actor)	-0.190	0.580	0.001	0.053
c_CI (partner)	-0.149	0.326	-0.095	-0.076
Valence (actor)	0.480 *	0.616	-0.419	0.614 *
Valence (partner)	-0.032	0.120	0.639 **	0.040
Activation (actor)	0.314 *	-0.266	-0.010	0.013
Activation (partner)	0.355 **	-0.636	0.499 **	0.339
Pseudo R <sup>2</sup>	0.362	0.284	0.373	0.213
	AP/DD (phase 3)		AD/DP (phase 3)	
	Model 13	Model 14	Model 15	Model 16
Predictors (phase 2)	DSS	noDSS	DSS	noDSS
Intercept	0.089	-0.211	0.170	0.279
c_CI (actor)	-0.132	0.429	0.137	-0.391
c_CI (partner)	-0.172	0.163	0.041	-0.302
AP/DD (actor)	0.176	0.498	-0.611 *	0.155
AP/DD (partner)	0.739 ***	-0.048	0.393	0.467
AD/DP (actor)	0.124	-0.734 *	0.296	0.152
AD/DP (partner)	0.107	-0.218	-0.271	0.534
Pseudo R <sup>2</sup>	0.479	0.443	0.286	0.092



\*\*\* p<.01; \*\* p<.05; \* p<.10



# Conclusio

Emotional dynamics differ with respect to whether a DSS is provided or not – even for a basic analytical DSS

- **Activation** is a central source of differences
  - Successful negotiations
    - DSS: towards activated pleasure (e.g. elated, excited)
    - noDSS: towards deactivated pleasure (e.g. content, at ease)
  - Failed negotiations
    - DSS: towards activated displeasure (e.g. anxious)
    - noDSS: towards displeasure (e.g. displeased, unhappy)
- **Impact** of decision support on **intra-personal** and **inter-personal** effects of emotional behaviors

The impact of **DSSs** (on affective behaviors)

- Information, feedback, or guidance functions (e.g. Bui, 1994; Singh & Ginzberg, 1996)
- Cognitive resources (e.g. Blascovich, 1990; Feldman, 1995; Jain & Solomon, 2000)
- EASI (emotion as social information) model (Van Kleef et al., 2010)
  - Dynamics of affective behaviors: Driven by inferential processes and affective reactions
  - Contingent on: Context (competitive or cooperative) and **epistemic motivation**
  - Decision support can increase **Epistemic ability**

# Implications

Importance of considering all **behavioral** aspects within and throughout the negotiations process

- Research on DSSs should focus more on the (emotional) behaviors of the people in interaction, since these are to be supported
  - Inter-personal and intra-personal effects over time: Reciprocity, actor effects, partner effects
- Using more elaborate research frameworks and treating dyadic interaction data appropriately is important to “pry open the black box of the negotiation process” (Weingart & Olekalns, 2004: p.154)

→ Toward “Affective Negotiation Support Systems” (Broekens et al., 2010)



universität  
wien

**Thank you for listening**

# References I

- Adair, W. L., & Brett, J. M. (2005). The negotiation dance: Time, culture, and behavioral sequences in negotiation. *Organization Science*, 16(1), 33–51. doi:10.1287/orsc.1040.0102
- Blascovich, J. (1990). Individual differences in physiological arousal and perception of arousal: Missing links in Jamesian notions of arousal-based behaviors. *Personality and Social Psychology Bulletin*, 16(4), 665–675. doi:10.1177/0146167290164007
- Borg, I., & Groenen, P. J. F. (2005). *Modern multidimensional scaling: Theory and applications* (2nd ed.). New York: Springer.
- Broekens, J., Jonker, C. M., & Meyer, J.-J. C. (2010). Affective negotiation support systems. *Journal of Ambient Intelligence and Smart Environments*, 2(2), 121–144. doi:10.3233/AIS-2010-0065
- Bui, T. X. (1994). Evaluating negotiation support systems: A conceptualization. In HICSS '94 Proceedings of the 27th Annual Hawaii International Conference on System Sciences (pp. 316–324).
- Feldman, L. A. (1995). Valence focus and arousal focus: Individual differences in the structure of affective experience. *Journal of Personality and Social Psychology*, 69(1), 153–166. doi:10.1037/0022-3514.69.1.153
- Hindriks, K. V., & Jonker, C. M. (2008). Creating human-machine synergy in negotiation support systems: Towards the pocket negotiator. In *HuCom08 Proceedings of the 1st International Working Conference on Human Factors and Computational Models in Negotiation* (pp. 47–54). Delft, The Netherlands: ACM.
- Holmes, M. E. (1992). Phase structures in negotiation. In L. L. Putnam & M. E. Roloff (Eds.), *Communication and negotiation* (20th ed., pp. 83–105). Newbury Park, California: Sage.
- Jain, B. A., & Solomon, J. S. (2000). The effect of task complexity and conflict handling styles on computer-supported negotiations. *Information and Management*, 37(4), 161–168. doi:10.1016/S0378-7206(99)00049-X
- Kenny, D. A., Kashy, D. A., & Cook, W. L. (2006). *Dyadic data analysis. Methodology in the Social Sciences*. New York, NY: Guilford Press.
- Kersten, G. E., & Lai, H. (2007). Negotiation support and e-negotiation systems: An overview. *Group Decision and Negotiation*, 16(6), 553–586. doi:10.1007/s10726-007-9095-5
- Koeszegi, S. T., Pesendorfer, E.-M., & Vetschera, R. (2011). Data-driven phase analysis of e-negotiations: An exemplary study of synchronous and asynchronous negotiations. *Group Decision and Negotiation*, 20(4), 385–410. doi:10.1007/s10726-008-9115-0
- Lawless, H. T., Sheng, N., & Knoops, S. S. C. P. (1995). Multidimensional scaling of sorting data applied to cheese perception. *Food Quality and Preference*, 6(2), 91–98. doi:10.1016/0950-3293(95)98553-U
- Lim, L.-H., & Benbasat, I. (1992-93). A theoretical perspective of negotiation support systems. *Journal of Management Information Systems*, 9(3), 27–44.

# References II

- Pommeranz, A., Brinkman, W.-P., Wiggers, P., Broekens, J., & Jonker, C. M. (2009). Design guidelines for negotiation support systems: An expert perspective using scenarios. In ECCE '09 European Conference on Cognitive Ergonomics .
- Russell, J. A. (1980). A circumplex model of affect. *Journal of Personality and Social Psychology*, 39(6), 1161–1178. doi:10.1037/h0077714
- Singh, D. T., & Ginzberg, M. J. (1996). An empirical investigation of the impact of process monitoring on computer-mediated decision-making performance. *Organizational Behavior and Human Decision Processes*, 67(2), 156–169. doi:10.1006/obhd.1996.0071
- Turel, O., Yuan, Y., & Rose, J. (2007). Antecedents of attitude towards online mediation. *Group Decision and Negotiation*, 16(6), 539–552. doi:10.1007/s10726-007-9085-7
- Van Kleef, G. A., De Dreu, C. K. W., & Manstead, A. S. R. (2010). An interpersonal approach to emotion in social decision making: The emotions as social information model. *Advances in Experimental Social Psychology*, 42(10), 45–96. doi:10.1016/S0065-2601(10)42002-X
- Vetschera, R. (2013). Negotiation processes: An integrated perspective. *EURO Journal on Decision Processes*, 1(1-2), 135–164. doi:10.1007/s40070-013-0006-5
- Watson, D., & Tellegen, A. (1985). Toward a consensual structure of mood. *Psychological Bulletin*, 98(2), 219–235. doi:10.1037/0033-2909.98.2.219
- Weigand, H., De Moor, A., Schoop, M., & Dignum, F. (2003). B2B negotiation support: The need for a communication perspective. *Group Decision and Negotiation*, 12(1), 3–29. doi:10.1023/A:1022294708789
- Weingart, L. R., & Olekalns, M. (2004). Communication processes in negotiation: Frequencies, sequences, and phases. In M. J. Gelfand & J. M. Brett (Eds.), *The handbook of negotiation and culture* (pp. 143–157). Stanford, CA: Stanford University Press.
- Yik, M. S. M., Russell, J. A., & Feldman Barrett, L. (1999). Structure of self-reported current affect: Integration and beyond. *Journal of Personality and Social Psychology*, 77(3), 600–619. doi:10.1037/0022-3514.77.3.600