# Revisiting Neighborhood Inverse Consistency on Binary CSPs

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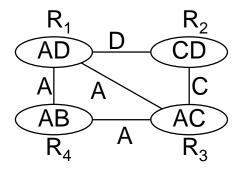


#### **Outline**

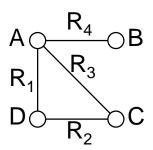
- Introduction: Relational NIC
- Structure of the dual graph of a binary CSP affects RNIC
- RNIC versus NIC, sCDC on binary CSPs
- Experimental results
- Conclusion

#### **Constraint Satisfaction Problem**

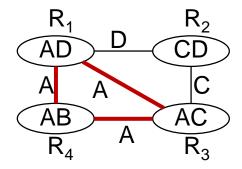
- Graphical Representation
  - Constraint graph
  - Dual graph
  - Minimal dual graph



Dual graph



Constraint graph



Minimal dual graph

[Janssen+,1989]



## **Neighborhood Inverse Consistency**

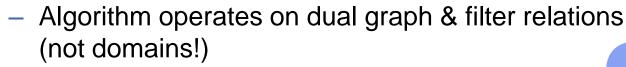
Relational NIC

[Woodward+ AAAI 2011]

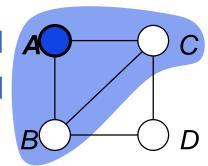
Reformulation of NIC [Freuder & Elfe, AAAI 1996]

Defined for dual graph

 Every tuple can be extended to a solution in its relation's neighborhood



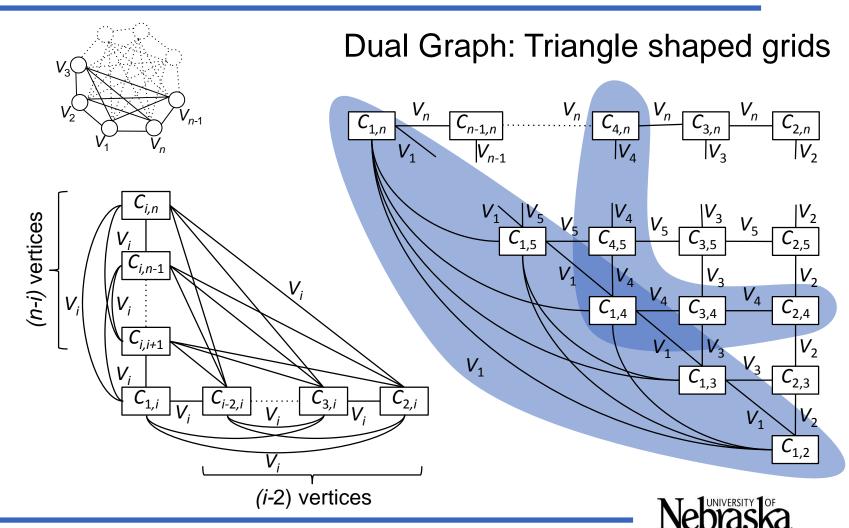
- Initially designed for non-binary CSPs
- How about RNIC on binary CSPs?
  - Impact of the structure of the dual graph
  - RNIC versus other consistency properties



 $\mathsf{R}_{\scriptscriptstyle{1}}$ 

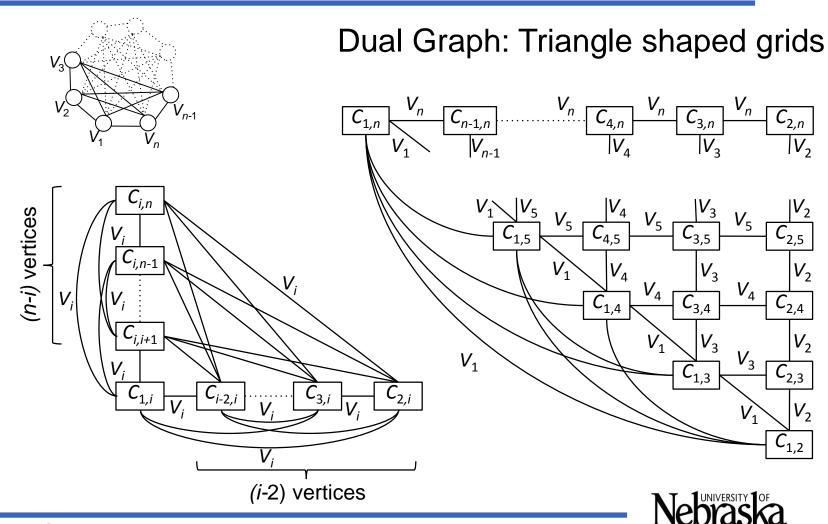


# **Complete Constraint Graph**



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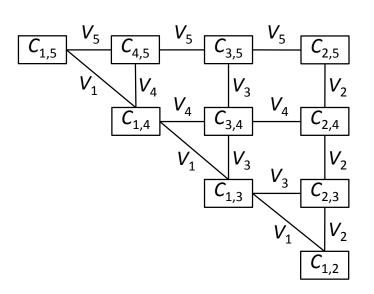
# **Minimal Dual Graph**



# **Minimal Dual Graph**

 $C_{1,2}$   $V_1$   $C_{1,5}$   $C_{1,5}$   $C_{2,4}$   $C_{2,5}$   $C_{3,5}$   $C_{4,5}$ 

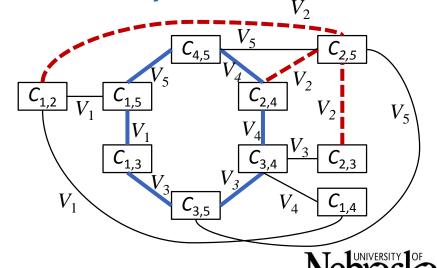
... can be a triangleshaped grid (planar)



but does not have to be

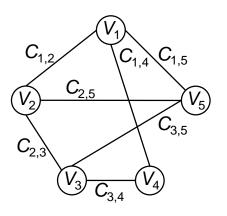
- Star on  $V_2$ 

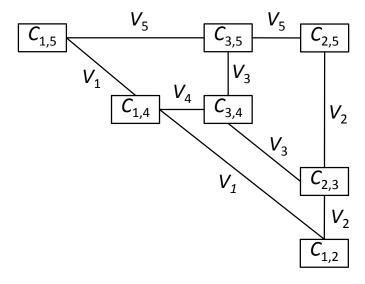
- Cycle of size 6



# Non-Complete Constraint Graph

- Can still be a triangle-shaped grid
  - Have a chain of vertices
  - of length ≤ n-1







# Impact on RNIC

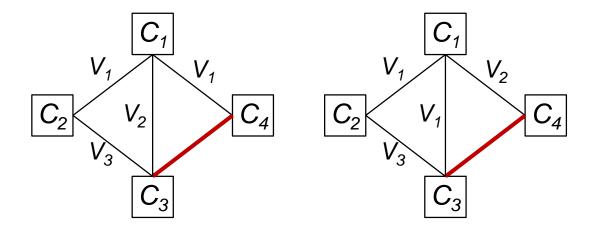
On a binary CSP, RNIC enforced on the minimal dual graph (wRNIC) is never strictly stronger than R(\*,3)C.

R(\*,m)C ensures that subproblem induced on the dual CSP by every connected combination of m relations is minimal [Karakashian+, AAAI 2010]



# wRNIC on Binary CSPs

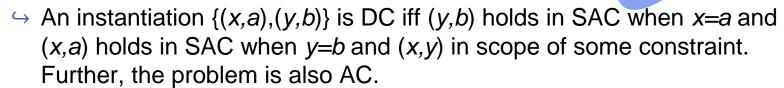
wRNIC can never consider more than 3 relations



 In either case, it is not possible to have an edge between C<sub>3</sub> & C<sub>4</sub> (a common variable to C<sub>3</sub> & C<sub>4</sub>) while keeping C<sub>3</sub> as a binary constraint

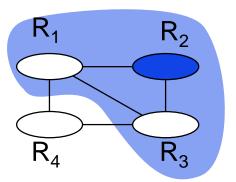
## NIC, sCDC, and RNIC not comparable

- NIC Property
- [Freuder & Elfe, AAAI 1996]
- variable's neighborhood
- sCDC Property [Lecoutre+, JAIR 2011]



RNIC Property

- [Woodward+, AAAI 2011]
- relation's neighborhood
- → wRNIC, triRNIC, wtriRNIC enforce RNIC on a minimal, triangulated, and minimal triangulated dual graph, respectively
- → selRNIC automatically selects the RNIC variant based on the density of the dual graph





### **Experimental Results (CPU Time)**

Benchmark	# inst.	AC3.1	sCDC1	NIC	selRNIC					
		CPU Time (msec)								
		NIC Quickest								
bqwh-16-106	100/100	3,505	3,860	1,470	3,608					
hawh-18-141	100/100	68 629	82 772	38.877	77 981					
coloring-sgb-queen	12/50	680,140	(+3) -	(+9) 57,545	634,029					
coloring-sgb-games	3/4	41,317	33,307	(+1) 860	41,747					
rand-2-23	10/10	1,467,246	1,460,089	987,312	1,171,444					
rand-2-24	3/10	567,620	677,253	<b>(+7)</b> 3,456,437	677,883					
		sCDC Quickest								
driver	2/7	(+5) 70,990	(+5) 17,070	358,790	(+4) 185,220					
ehi-85	87/100	(+13) 27,304	(+13) 573	513,459	(+13) 75,847					
ehi-90	89/100	(+11) 34,687	(+11) 605	713,045	(+11) 90,891					
frb35-17	10/10	41,249	38,927	179,763	73,119					
		RNIC Quickest								
composed-25-1-25	10/10	226	335	1,457	114					
composed-25-1-2	10/10	223	283	1,450	88					
composed-25-1-40	9/10	(+1) 288	(+1) 357	120,544	(+1) 137					
composed-25-1-80	10/10	223	417	(+1) -	190					
composed-75-1-25	10/10	2,701	1,444	363,785	305					
composed-75-1-2	10/10	2,349	1,733	48,249	292					
composed-75-1-40	7/10	(+1) 1,924	(+3) 1,647	631,040	(+3) 286					
composed-75-1-80	10/10	1,484	1,473	(+1) -	397					

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## **Experimental Results (BT-free, #NV)**

Benchmark	# inst.	AC3.1	sCDC1	NIC	selRNIC	AC3.1	sCDC1	NIC	selRNIC	
		BT-Free				#NV				
		NIC Quickest								
bqwh-16-106	100/100	0	3	8	5	1,807	1,881	739	1,310	
bqwh-18-141	100/100	0	0	1	0	25,283	25,998	12,490	22,518	
coloring-sgb-queen	12/50	1	-	16	1	91,853	-	15,798	91,853	
coloring-sgb-games	3/4	1	1	4	1	14,368	14,368	40	14,368	
rand-2-23	10/10	0	0	10	0	471,111	471,111	12	471,111	
rand-2-24	3/10	0	0	10	0	222,085	222,085	24	222,085	
		sCDC Quickest								
driver	2/7	1	2	1	1	3,893	409	3,763	3,763	
ehi-85	87/100	0	100	87	100	1,425	0	0	0	
ehi-90	89/100	0	100	89	100	1,298	0	0	0	
frb35-17	10/10	0	0	0	0	24,491	24,491	24,491	24,346	
		RNIC Quickest								
composed-25-1-25	10/10	0	10	10	10	153	0	0	0	
composed-25-1-2	10/10	0	10	10	10	162	0	0	0	
composed-25-1-40	9/10	0	10	9	10	172	0	0	0	
composed-25-1-80	10/10	0	10	-	10	112	0	-	0	
composed-75-1-25	10/10	0	10	10	10	345	0	0	0	
composed-75-1-2	10/10	0	10	10	10	346	0	0	0	
composed-75-1-40	7/10	0	10	7	10	335	0	0	0	
composed-75-1-80	10/10	0	10	-	10	199	0	-	0	

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#### **Conclusions**

#### Contributions

- Apply RNIC to binary CSPs
- Structure of dual graph & impact of RNIC
- NIC, sCDC, and RNIC are incomparable
- Empirically shown benefits of higher-level consistencies

#### Future work

- Study impact of the structure of the dual graph on (future) relational consistency properties
- 'Predict' appropriate consistency property using information about the problem and its structure

