


**Scribe Notes:** 1/28/2013  
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**Scribe:** Nate Stender  
**Topic:** Temporal Reasoning (Ch. 12 of Dechter book)

## Question by Daniel Dobbs:

How do we know when a constraint is convex?

a. In a CSP, we can look at the bit-matrix representation of the binary constraints:

$$\begin{bmatrix} 0 & 1 & 1 & 0 \\ 1 & 1 & 1 & 1 \\ 1 & 0 & 0 & 1 \end{bmatrix} \rightarrow \begin{bmatrix} 0 & 0 & 1 & 1 \\ 1 & 1 & 1 & 1 \\ 1 & 1 & 0 & 0 \end{bmatrix}$$


If we can swap rows in the bit-matrix representation such that all of the ones in each row are consecutive (consecutive-ones property), then we say that the constraints are row convex.<sup>1</sup> If the constraints remain row convex after enforcing consistency (a posteriori condition), then a known result guarantees that PC  $\Rightarrow$  Minimality  $\Rightarrow$  Decomposable.<sup>2</sup>

b. In a CSP where constraints or domains can be arranged as intervals with a total ordering and that those intervals are not fragmented by the operations of enforcing consistency (composition and intersection), then the constraints are convex.

## Temporal Reasoning: $\Delta$ STP

The algorithm:

- Is a refinement of the algorithm for PPC<sup>3</sup>
- Works by updating all edges in a triangle at every propagation step
- Changes are propagated to adjacent triangles

### Advantages of $\Delta$ STP

- Cheaper than PPC and F-W (empirical proof)
- Guarantees the minimal network
- Automatically decomposes graph into its bi-connected components
  - Binds effort in the size of the largest component

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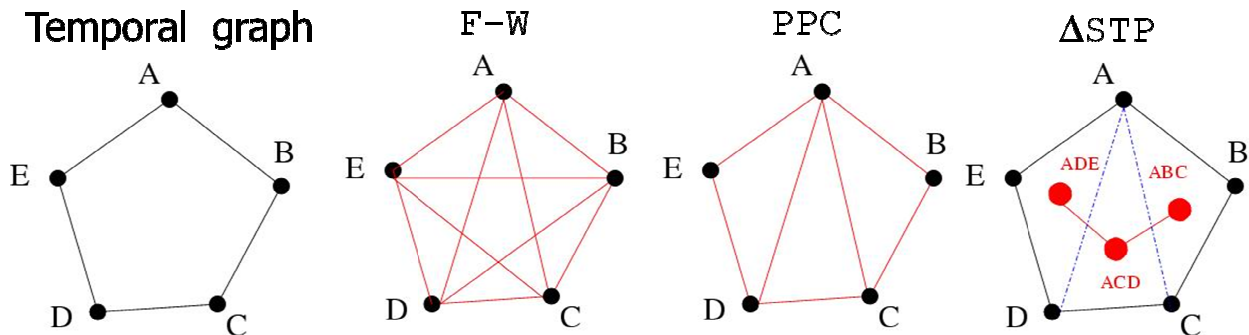
<sup>1</sup> See textbook page 231—237.

<sup>2</sup> On the Minimality and Decomposability of Row-Convex Constraint Networks, Peter van Beek and Rina Dechter, *Journal of the ACM*, Vol 42(3). Pages 543—561. 1995

<sup>3</sup> Path Consistency on Triangulated Constraint Graphs, Christian Bliet and Djamila Sam-Haroud, *Proceedings of IJCAI 1999*. Pages 456—461. 1999.

- Allows for parallelization
- Sweep through back and forth (relation to tree decomposition made by N. Wilson in 2005).

## Temporal graph



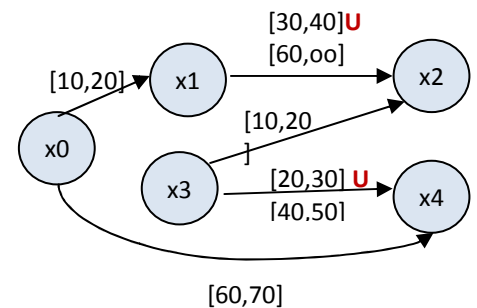
## Recent Advances in $\Delta$ STP<sup>4</sup>

- Exploit structure
  - Order variables linearly
  - Use a PEO (bottom-up ordering) or Max Cardinality ordering (top down ordering)
- Apply Directional Path Consistency (Ch 4. Dechter): Determines consistency
- Propagate down: Provides minimal network

## Temporal Reasoning: Solving the TCSP

### Review of TCSP

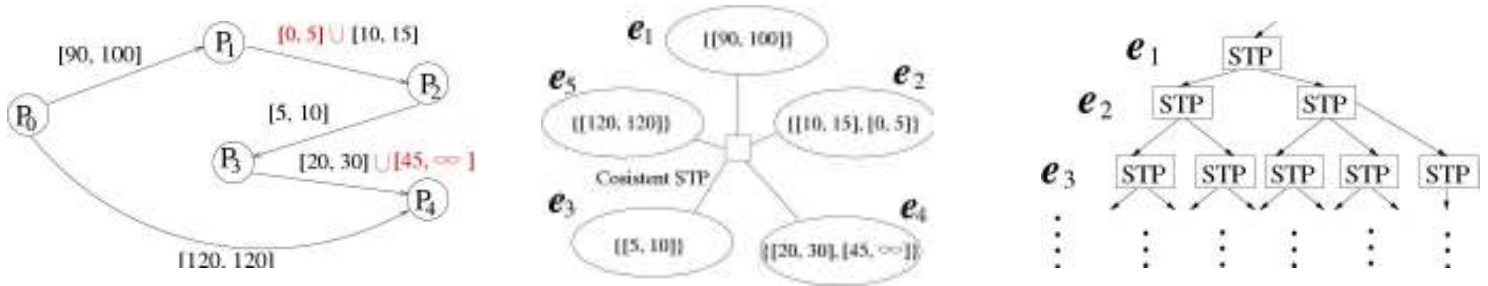
- Variables represent time points, each with a continuous domain
- Each constraint is a disjunction of intervals
- Solution is an assignment which does not violate any constraints
- Deciding consistency of a TCSP instance is NP-complete



### Solving the TCSP

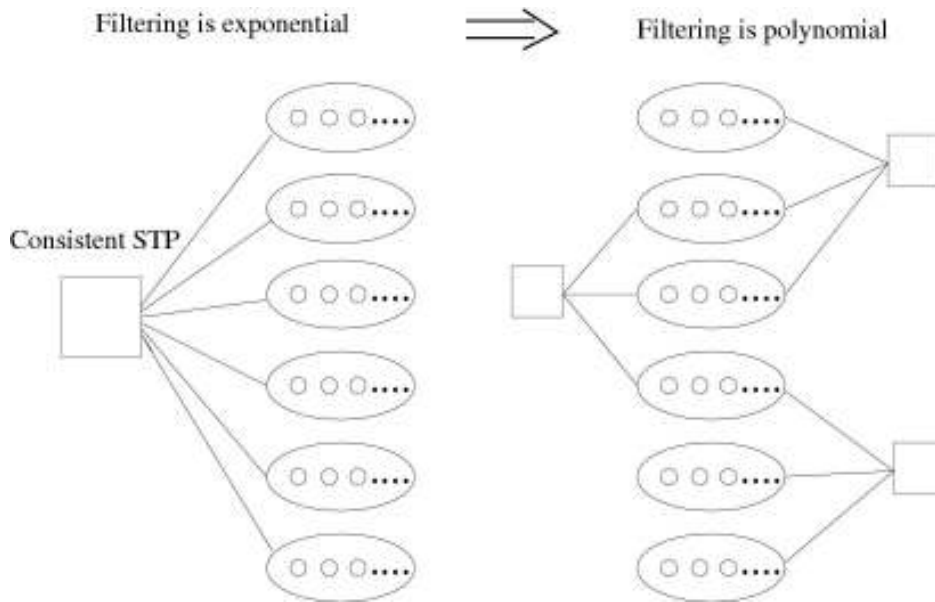
- Formulate TCSP as meta-CSP
- Find all solutions to the meta-CSP
- Use ULT (Dechter's textbook), or  $\Delta$ STP to solve the individual STPs efficiently (Xu Lin's CP 2003)

<sup>4</sup> P3C: A New Algorithm for the Simple Temporal Problem, Leon Planken, Mathijs de Weerd, Roman van der Krogt *Proceedings of ICAPS 2008*, Pages 256—263. 2008.



**Preprocessing the TCSP**

- Arc consistency on the meta-CSP (with GAC) is NP-hard because it corresponds to solving the TCSP
- Use  $\Delta$ AC to filter the domains of TCSP with ternary constraints
- $\Delta$ AC removes values that are not supported in the ternary constraint.



$\Delta$ STP is very effective at low density,  $\Delta$ AC is very effective at high density. We can combine them to create a powerful tool.