# ON DEPENDENT VARIABLES IN REACTIVE SYNTHESIS

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Joint work with S. Akshay, Eliyahu Basa and Dror Fried (TACAS 2024)

Input signal from sensors



Output actions made by AV

Input signal from sensors



Output actions made by AV

Specification

Don't run into a wall

Input signal from sensors



Output actions made by AV

#### Specification

Don't run into a wall

#### Program/plan

- Stop when observes a wall nearby
- Slow down when observes a dead-end sign

Input signal from sensors



Output actions made by AV

#### Specification

Don't run into a wall



#### Verification

- Testing
- Model Checking



#### Program/plan

- Stop when observes a wall nearby
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Output actions made by AV

#### Specification

Don't run into a wall



Synthesis



#### Program/plan

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# **Synthesis**

#### Specification (declaration)

Logical expression







#### System (implementation)

- Program
- Circuit
- State Machine

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- First order logic  $\neg \forall r, \forall r' \exists g ((r > r') \land Arrive(g, r')) \rightarrow Arrive(g, r))$
- Temporal logic *always*  $(r \rightarrow (g \lor next g))$
- Boolean logic  $\neg (r \land r') \rightarrow (r \lor g) \land (r' \lor g)$

UNDECIDABLE

**2EXPTIME - COMPLETE** 

in EXPTIME

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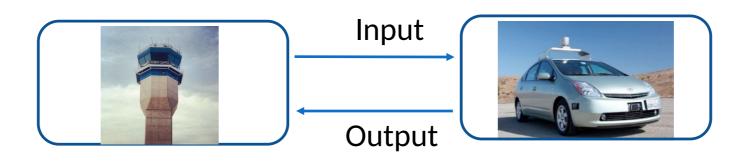
# Synthesis: From Specification to a Program



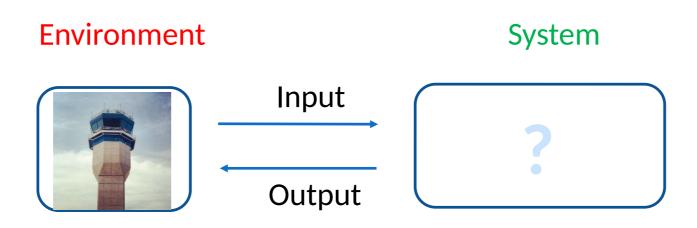
# Synthesis: From Specification to a Program

Functional systems Output

Reactive systems

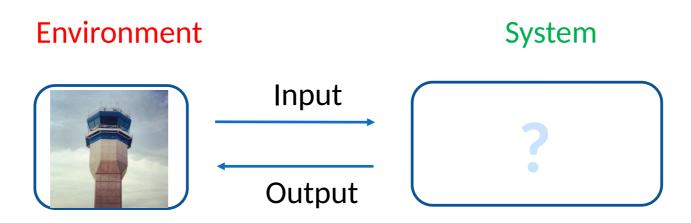


# **Reactive Synthesis**



Given: linear temporal logic specification  $\varphi$  over inputs and outputs vars

Objective: synthesize a (reactive) system that will meet the specification



At every time step: if *control* requests data then either grant now or grant at the next time

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r, g – propositional variables

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	i = 0	i = 1	i = 2	i = 3	
env	r	r	∍r	∍r	
sys	g	¬ g	g	¬ g	

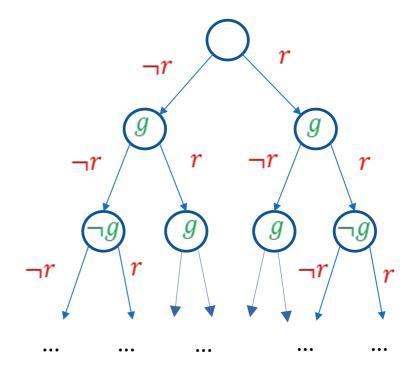
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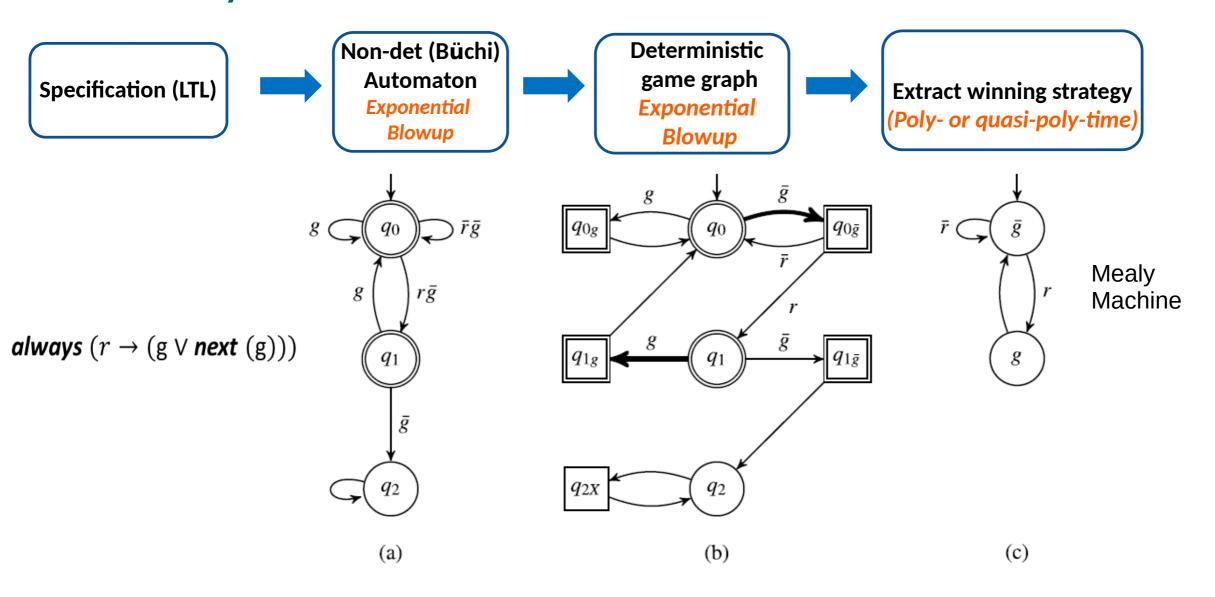
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r, g – propositional variables



**Strategy Tree** 

# **Reactive Synthesis Flow**



# Dependency in LTL

$$\varphi = \neg x \land Always(Next x \leftrightarrow (y_1 \land Next y_2)) \land \psi(x, z, y_1, y_2, y_3)$$

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$$i = 0 x[i] = 0$$

i > 0  $\mathbf{x}[i]$  always assigned to  $y_2[i] \land y_1[i-1]$ 

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  - Average of 41% dependent outputs in the 300 benchmarks
  - 26 benchmarks where all outputs are dependent

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#### Example from SYNTCOMP - Itl2dpa14

$$FG\left(\neg a \rightarrow \left(GFp_{0} \lor (GFp_{2} \land \neg GFp_{1})\right)\right) \land G\left(\left(p_{0} \land \neg p_{1} \land \neg p_{2}\right) \lor \left(\neg p_{0} \land p_{1} \land \neg p_{2}\right) \lor \left(\neg p_{0} \land \neg p_{1} \land p_{2}\right)\right)$$

$$p_{0} \text{ is dependent on } \{p_{1}, p_{2}\}$$

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$$p_0 \text{ is dependent on } \{p_1, p_2\}$$

- Dependency in Boolean Functional Synthesis
  - [Akshay et al '18, '19, '20, '23; Golia et al'20, '21, '23; Mengel and Slivovsky'21; Peitl et al'19]
  - Tools: Manthan, BFSS

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- Dependency significantly helps Boolean Functional Synthesis
  - [Akshay et al '18, '19, '20, '23; Golia et al'20, '21, '23; Mengel and Slivovsky'21; Peitl et al'19]
  - Tools: Manthan, BFSS
- Can we lift ideas from Boolean Functional Synthesis to Reactive Synthesis?
  - Boolean Synthesis by I/O Separation [CFTY'21] → LTL/LTLf synthesis [ABFTYW'21, DFPZ'23]

### Research Questions:

- How do we formally define dependency in reactive synthesis?
- How do we find dependent variables?
- How do we exploit dependency in reactive synthesis?
- Do experiments confirm the dependency benefits?

# Dependency in Boolean Formulas

In a Boolean formula  $F(x, y_1, ..., y_k)$ , x is dependent on  $Y \subseteq \{y_1, ..., y_k\}$  if

For every two satisfying assignments  $\sigma$ ,  $\sigma'$  for F

if 
$$\sigma|_{Y} = \sigma'|_{Y}$$
 then  $\sigma|_{x} = \sigma'|_{x}$ 

# Dependency in Boolean Formulas

$$F = (x \leftrightarrow (y_1 \land y_2)) \land (x \lor y_3)$$

Then x is dependent on  $\{y_1, y_2\}$  in F

Finding dependent variables in Boolean formulas is not always obvious.

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Finding dependent variables in Boolean formulas is not always obvious.

Dependencies can exist even without syntactic equivalences

$$(y_1 \lor \neg x_2) \land (x_2 \lor \neg y_1) \land ((x_1 \land x_2) \lor (\neg x_1 \land \neg y_1))$$
:  $x_2$  dependent on  $x_1$ 

# Dependency in LTL

In an LTL formula,  $\varphi(x, y_1 \dots y_k)$ , x is dependent on  $Y \subseteq \{y_1 \dots y_k\}$  if:

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For every two infinite words w, w' that satisfy  $\varphi$ ,

For every  $i \ge 0$ 

If 
$$w[0 ... i - 1] = w'[0 ... i - 1]$$
 and  $w[i]|_{Y} = w'[i]|_{Y}$ 

then 
$$w[i]|_{x} = w'[i]|_{x}$$

(w[0,-1]) is the empty word)

# Non-Dependent Variables

In an LTL formula,  $\varphi(x, y_1 \dots y_k)$ , x is non-dependent on  $Y \subseteq \{y_1 \dots y_k\}$  if:

There exist two infinite words w, w' that satisfy  $\varphi$ ,

there exists  $i \ge 0$  s.t.

$$w[0 ... i - 1] = w'[0 ... i - 1], w[i]|_{Y} = w'[i]|_{Y}$$

and 
$$w[i]|_{x} \neq w'[i]|_{x}$$

```
\varphi = \neg x \land Always(Next \ x \leftrightarrow (y_1 \land Next \ y_2)) \land Finally (y_3)
```

x is dependent on  $\{y_1, y_2\}$ 

$$\varphi = \neg x \land Always(Next \ x \leftrightarrow (y_1 \land Next \ y_2)) \land Finally(y_3)$$

x is dependent on  $\{y_1, y_2\}$ 

	i=0	i=1	i=2	i=3	i=4	•••
X	0					•••
$y_1$	0					•••
$y_2$	0					•••
<b>y</b> 3	0					•••

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	i=0	i=1	i=2	i=3	i=4	•••
X	0	0				•••
$y_1$	0	1				•••
$y_2$	0	1				•••
<b>y</b> 3	0	0				•••

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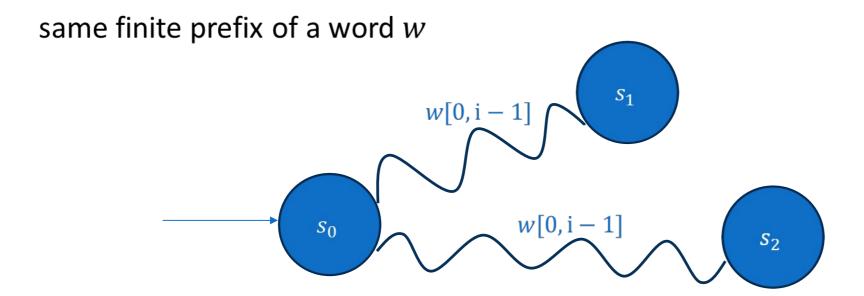
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$y_1$	0	1	1	1	0	
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<i>y</i> <sub>3</sub>	0	0	0	1	1	

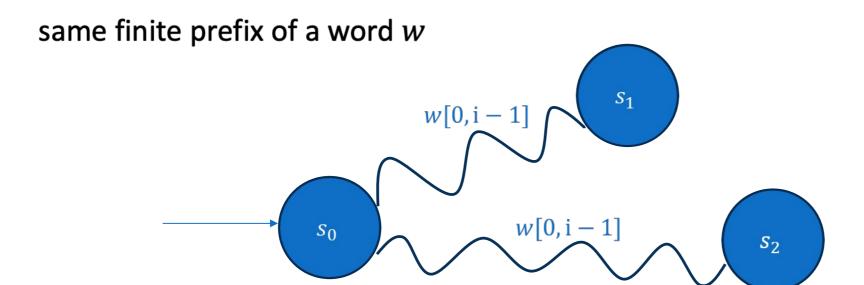
Specification  $\varphi$  Non-deterministic Büchi Automaton  $A_{\varphi}$ 

- Standard construction:  $L(\varphi) = L(A_{\varphi})$
- Prune NBA  $A_{\varphi}$ : remove all states/edges that do not lead to accepting states.
- All our NBAs are pruned.

States  $s_1, s_2$  are compatible if both  $s_1$  and  $s_2$  can be reached from start state on



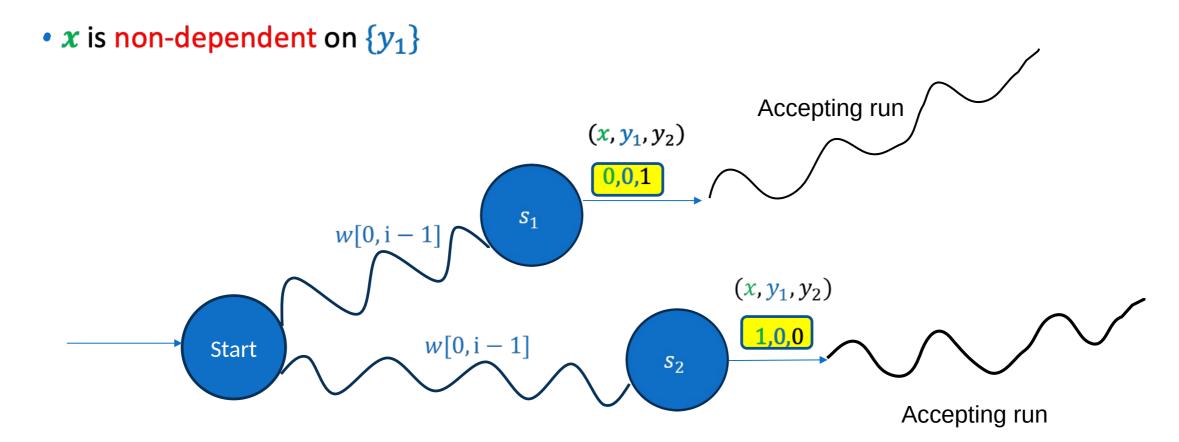
States  $s_1, s_2$  are compatible if both  $s_1$  and  $s_2$  can be reached from start state on



We find all (unordered) pairs of compatible states in  $A_{\omega}$ 

$$\{(s_0, s_0), (s_1, s_1), (s_2, s_2), (s_1, s_2)\}$$

### Example of not-dependent variable



- 1.  $Y = Vars(\varphi)$
- 2. Pick next variable  $x \in Y$
- 3. For each pair of compatible states  $(s_1, s_2)$

If x is non-dependent on  $Y \setminus \{x\}$  from  $(s_1, s_2)$  then go to step 2

- 4. Mark x as dependent on Y
- 5.  $Y = Y \setminus \{x\}$ , go to step 2

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- Gives a subset-maximal set of dependent variables.
- Order of variables in Step 2 is important.

(See paper for details)

### Utilizing dependency in synthesis

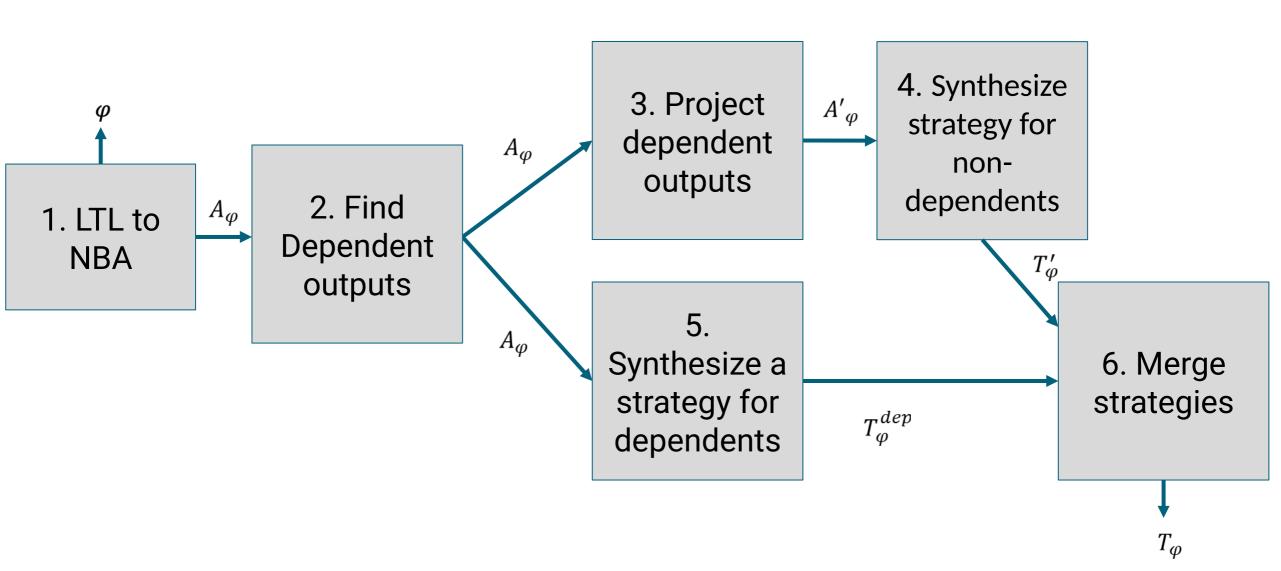
LTL specification  $\varphi(I, O)$  where I are the inputs and O are the outputs

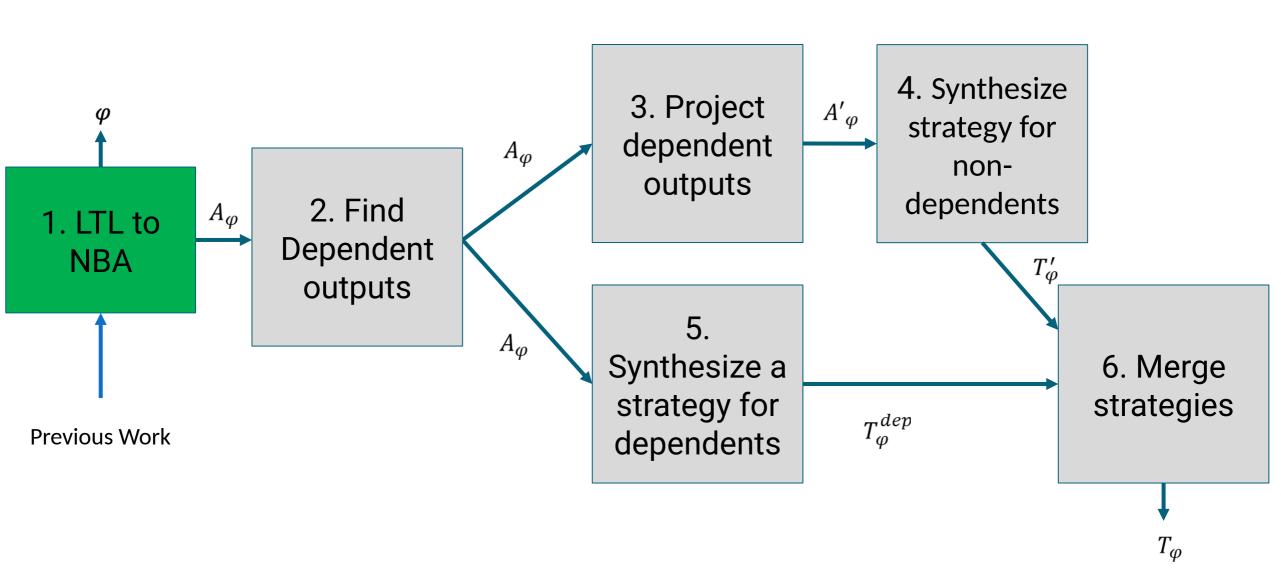
We focus on finding dependent output variables.

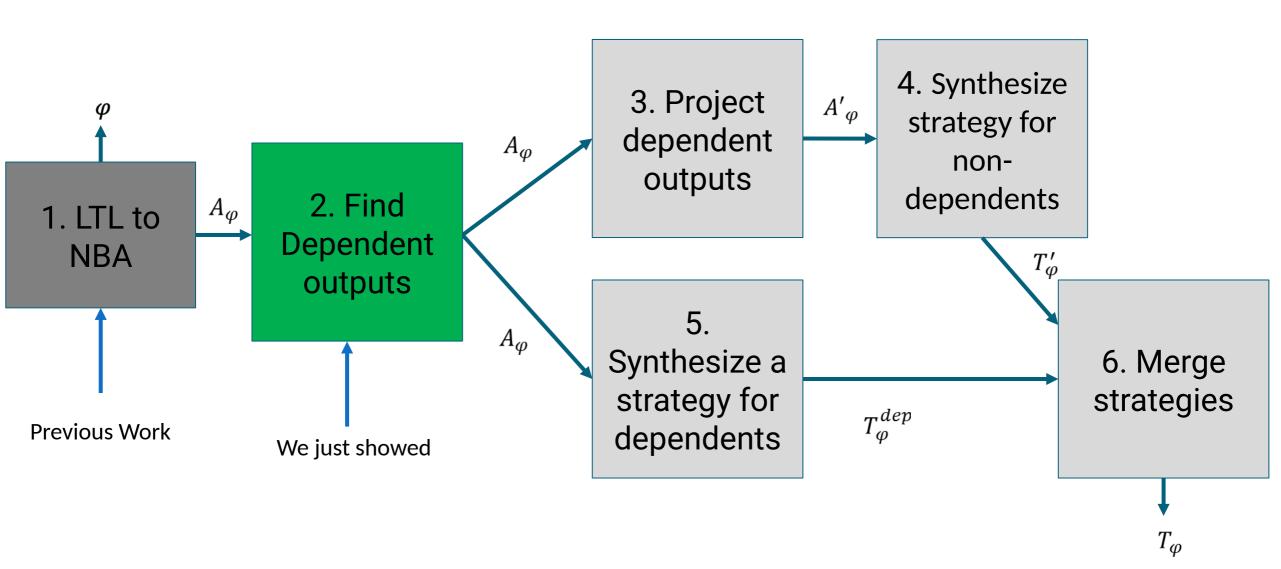
an output variable can be dependent on both input and other output variables

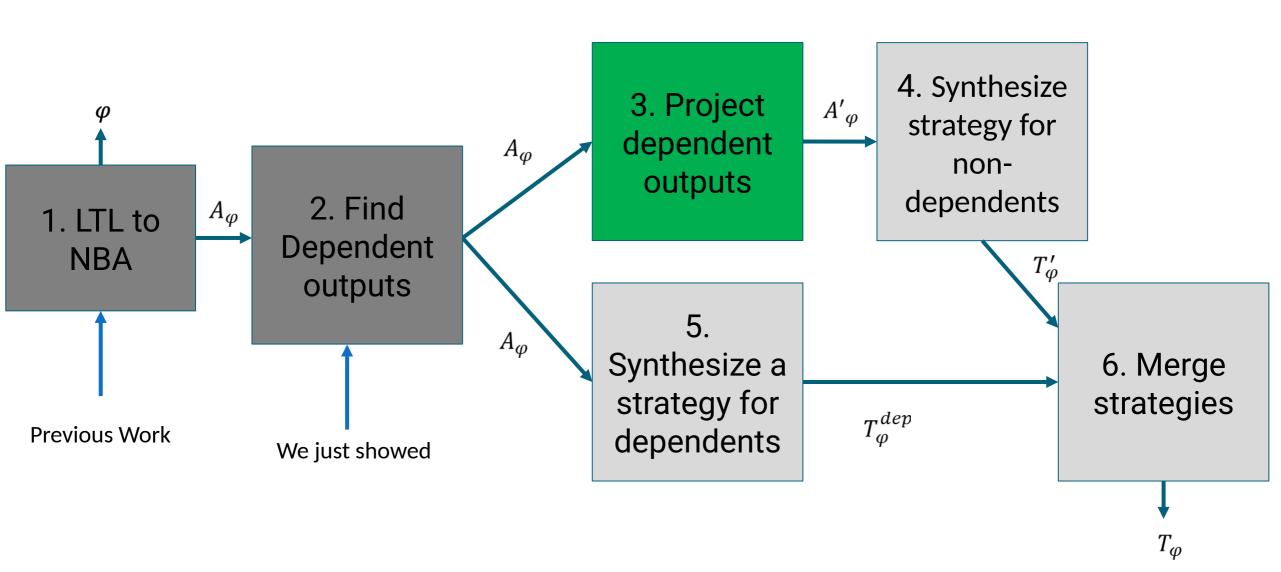
**Synthesis Flow** 

LTL 
$$\varphi$$
 NBA  $A_{\varphi}$  (symbolic) Mealy Machine  $T_{\varphi}$ 





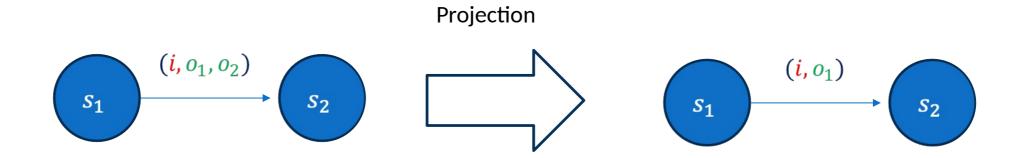


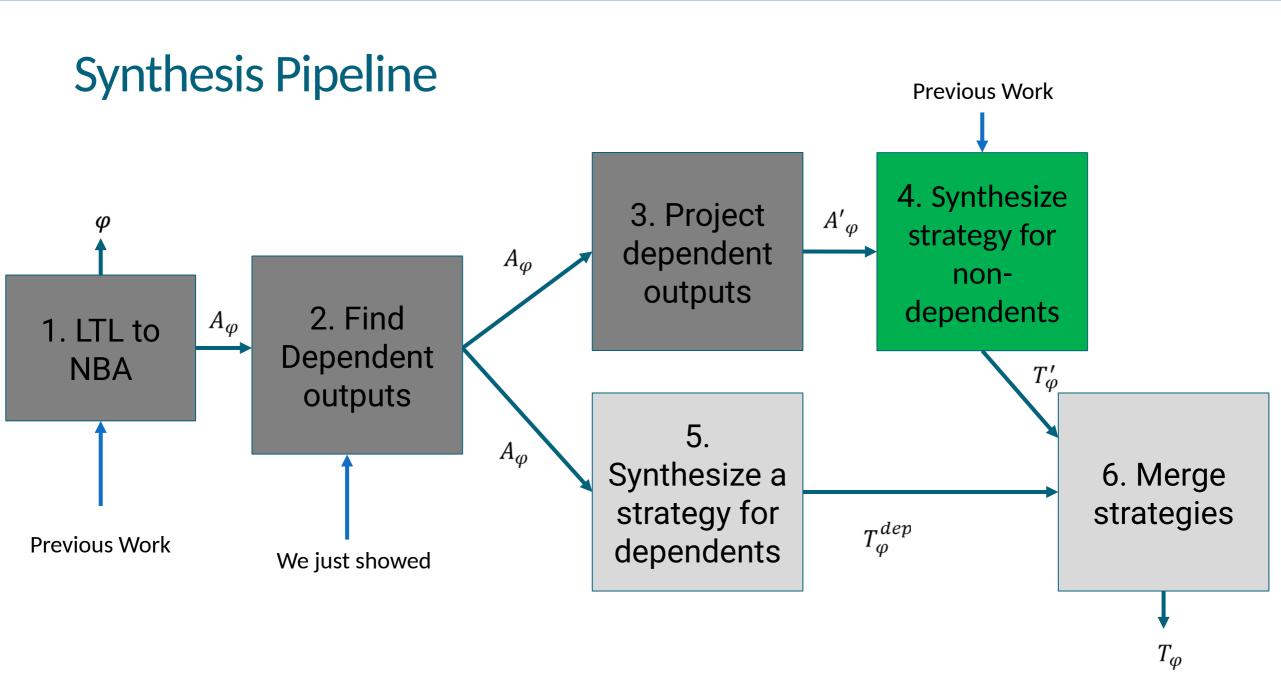


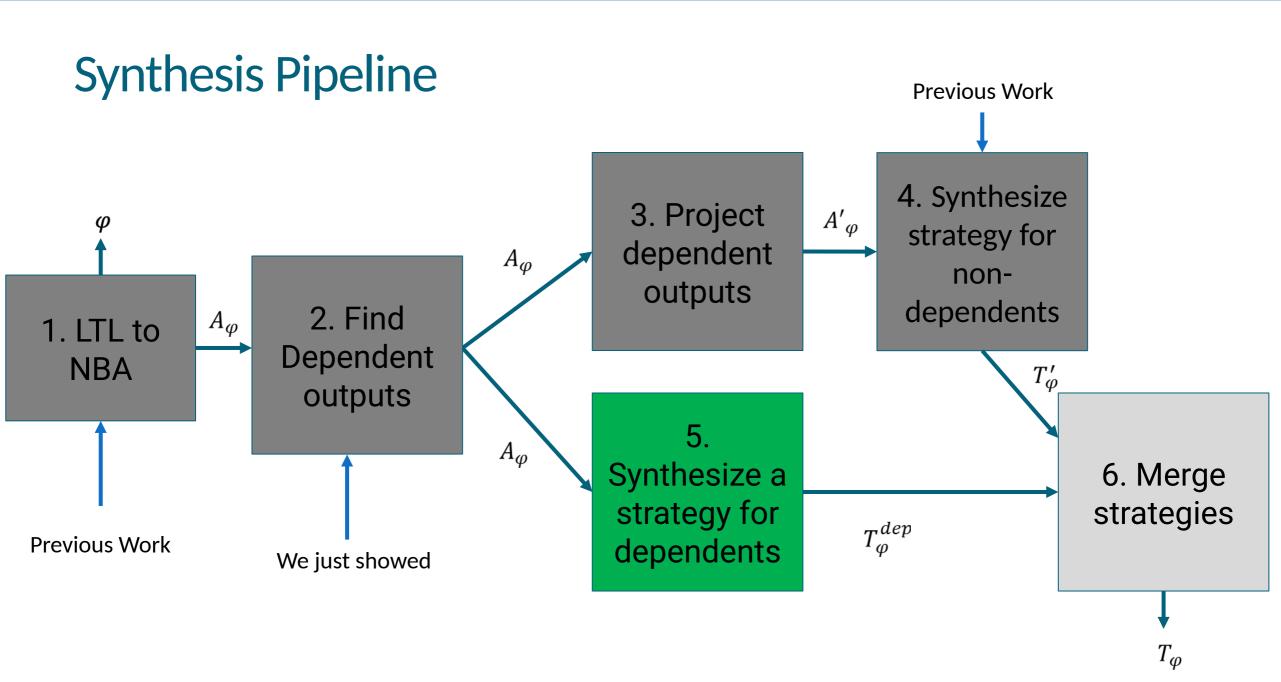
#### Step 3: Project dependent variables

The projection process removes the dependent variables from all NBA edges labels.

Assume  $o_2$  is dependent on  $\{i, o_1\}$  in  $\varphi(i, o_1, o_2)$ .







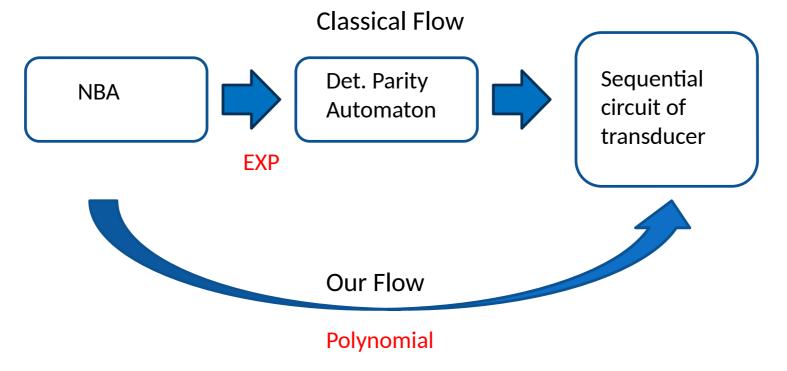
Inputs: original inputs and non-dependent output variables

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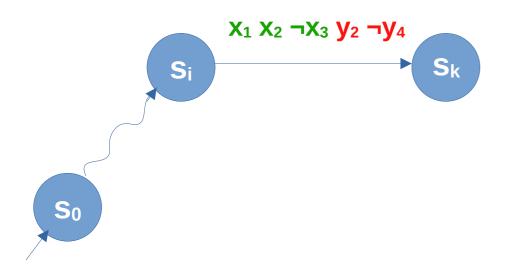
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Outputs: Symbolic Mealy machine for dependent output variables

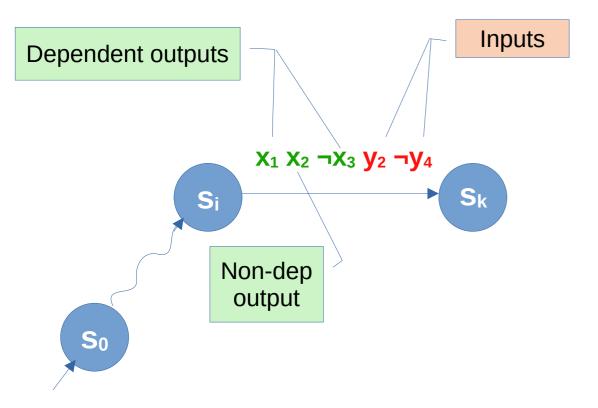


Based on implicit subset-construction (See details in the paper)

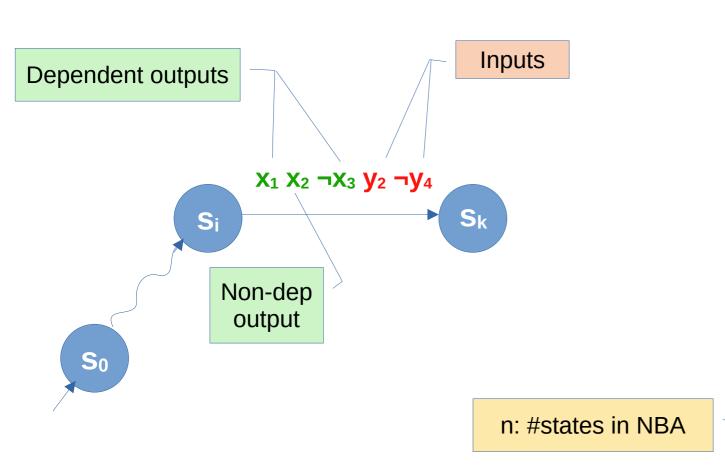
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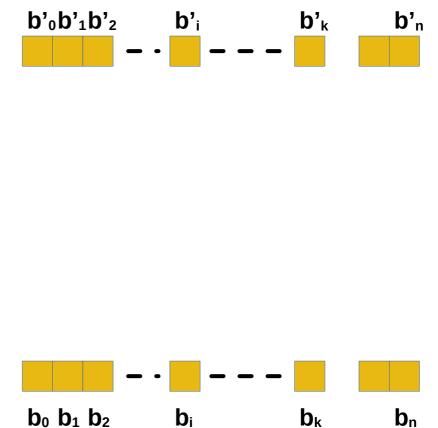


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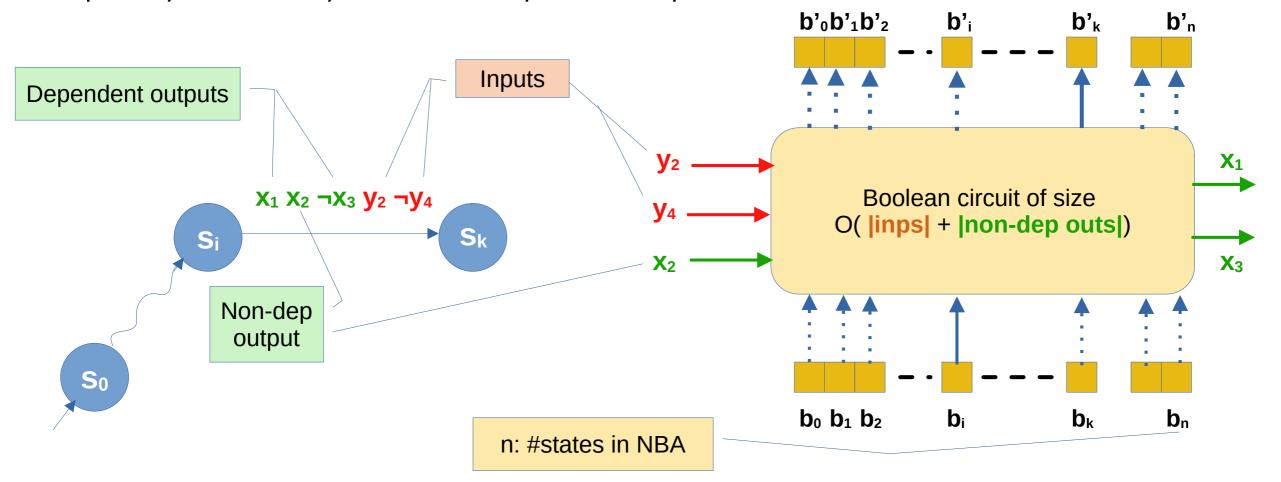


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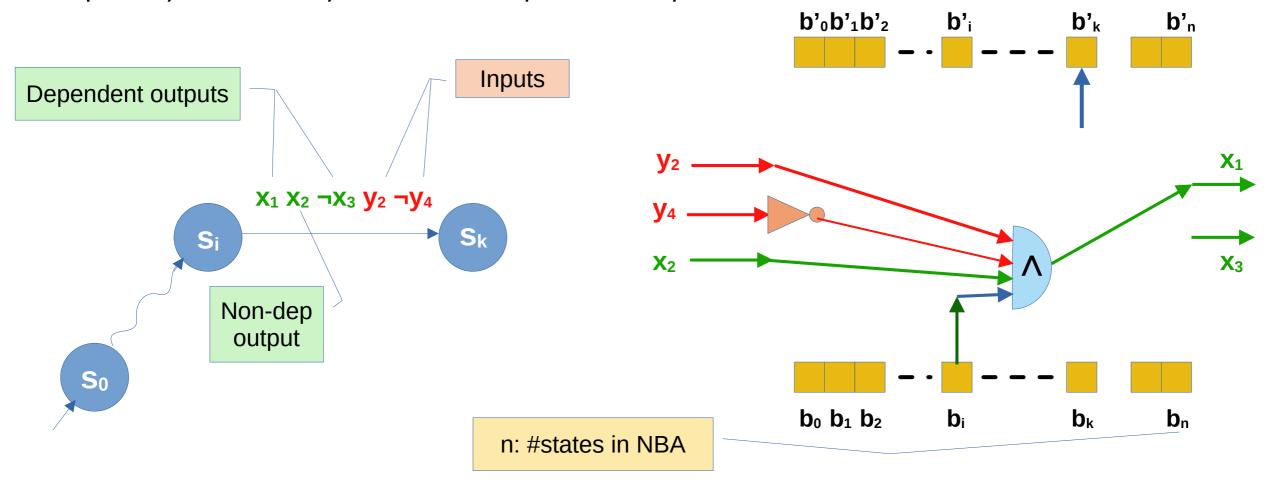




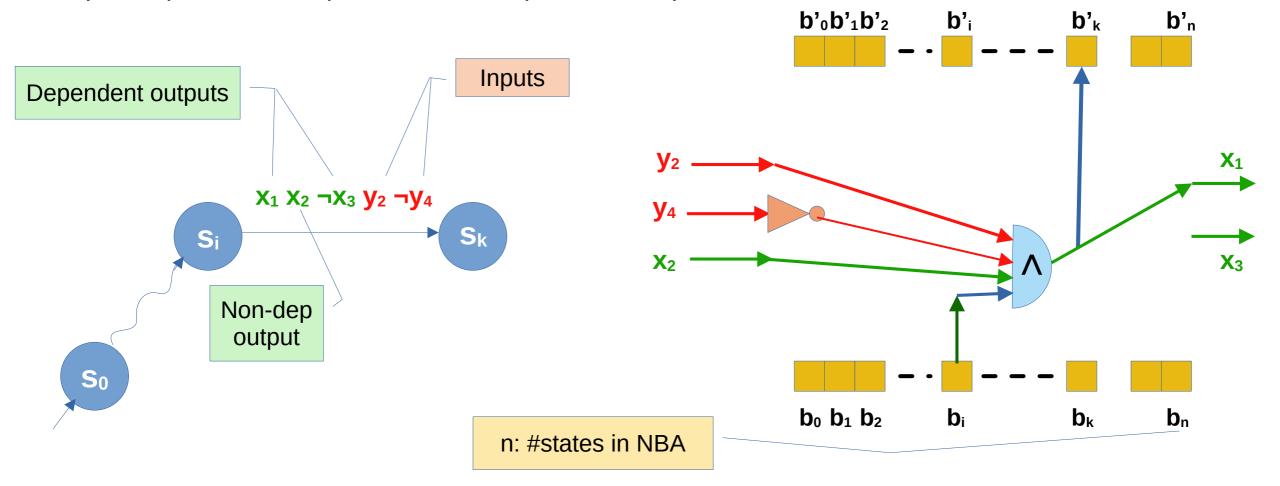
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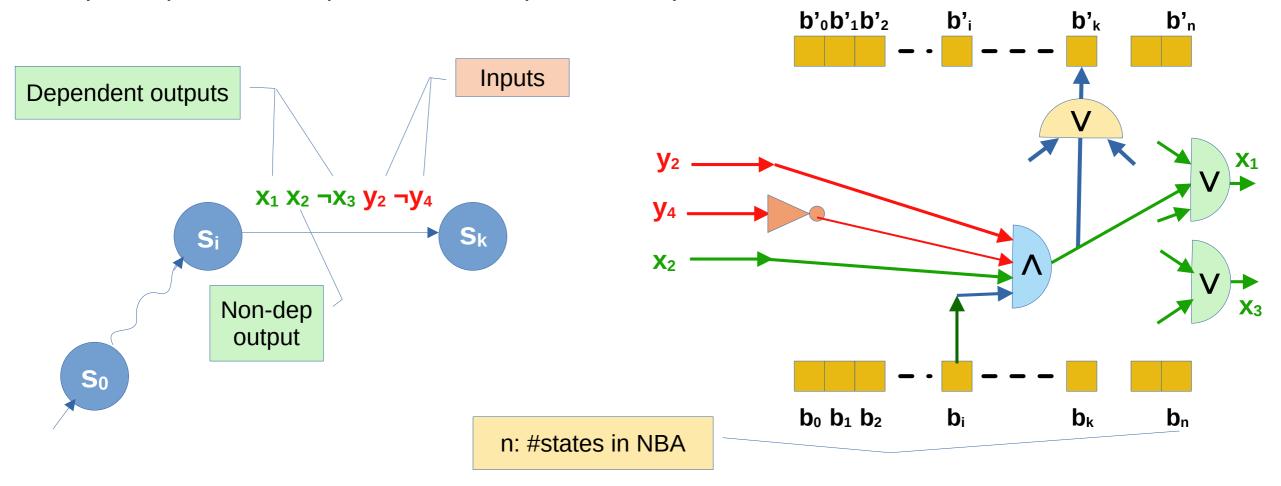
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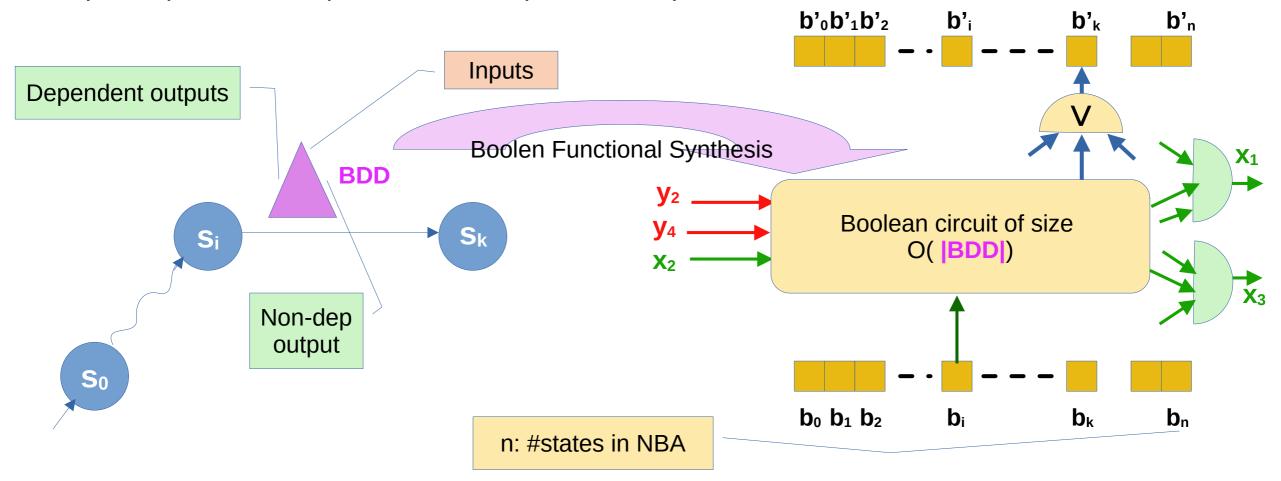
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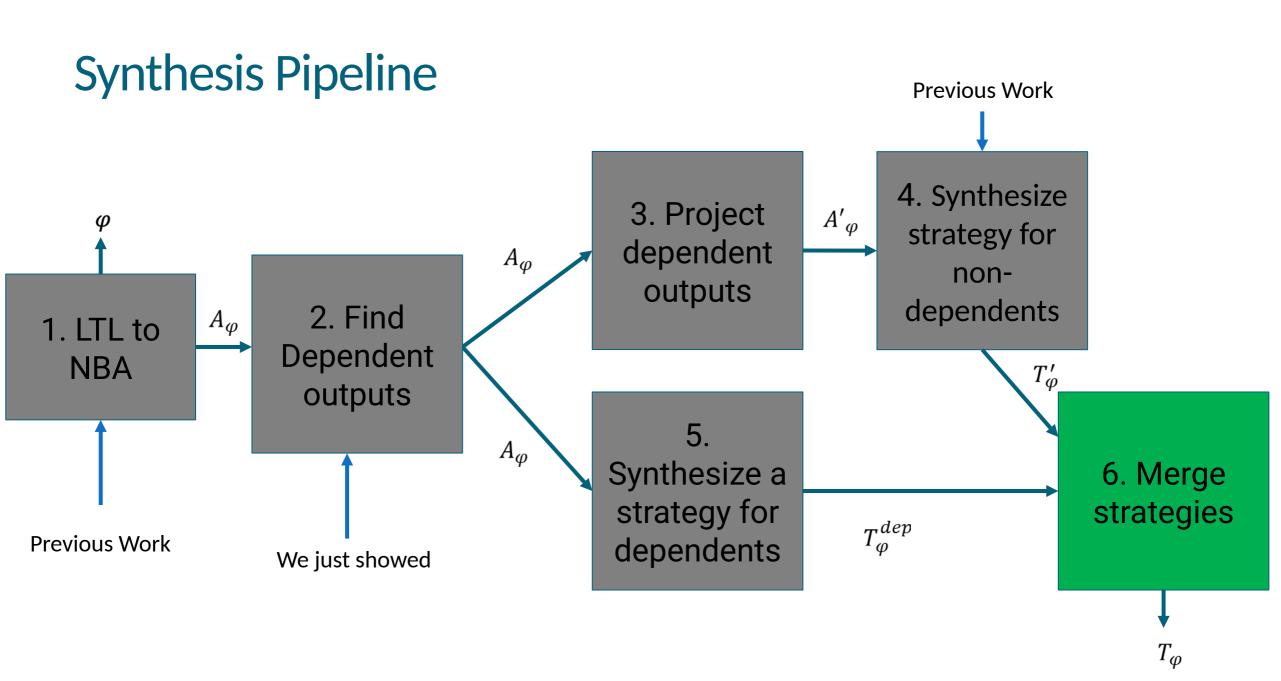


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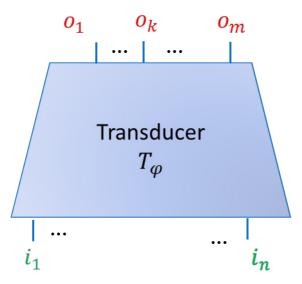


### Step 6: Merge Transducers

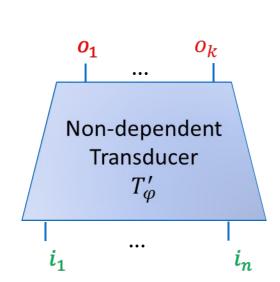
Our transducers are described as a sequential circuits.

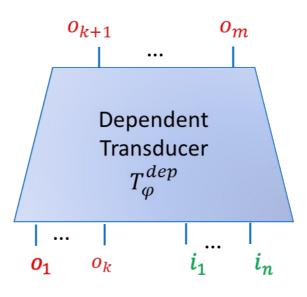
 $o_1, \dots, o_k$  are non-dependent variables

 $o_{k+1}, \dots, o_m$  are dependent variables



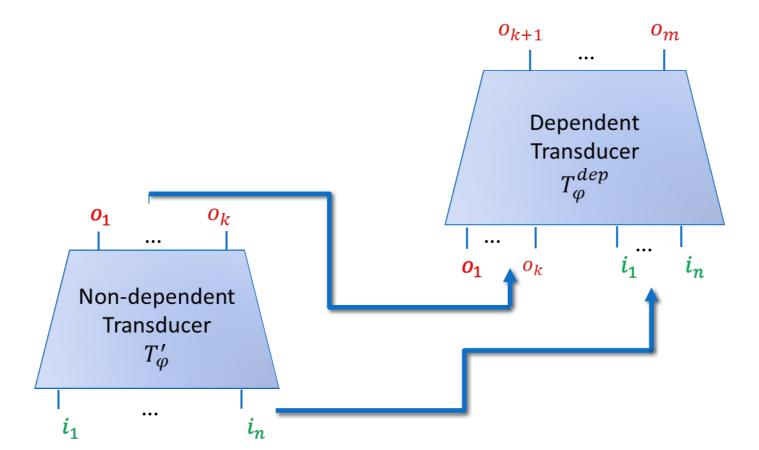
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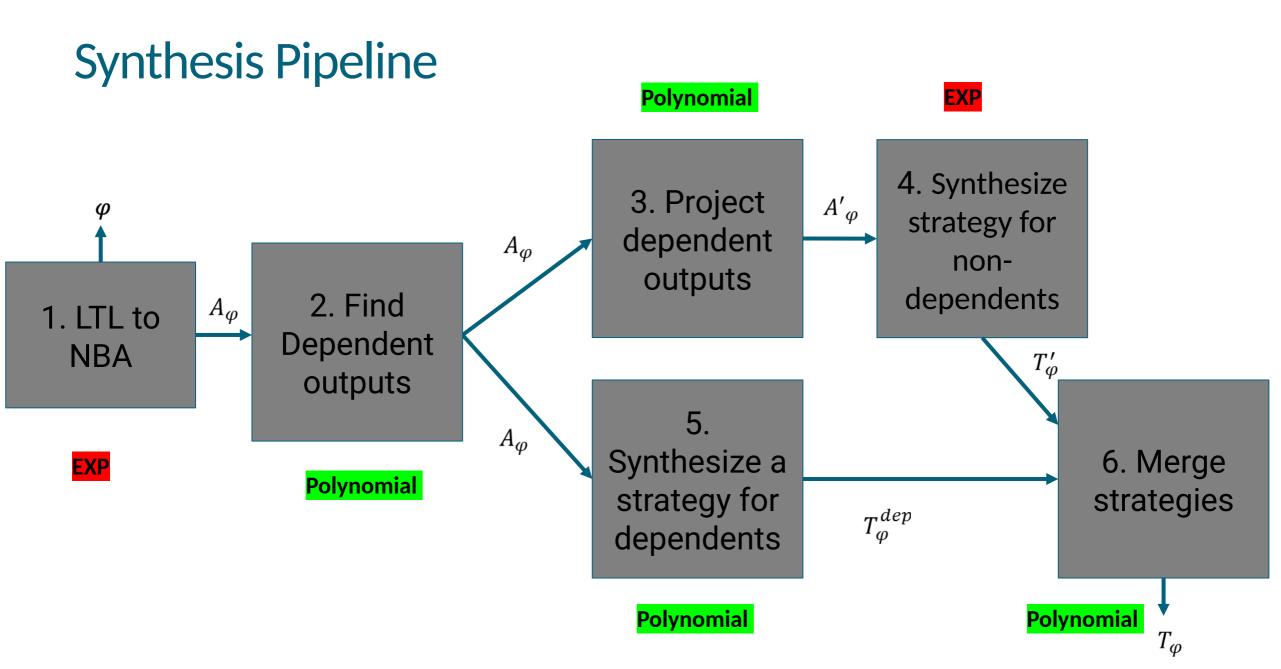




# Step 6: Merge Transducers

Merge is simply connecting outputs and inputs.



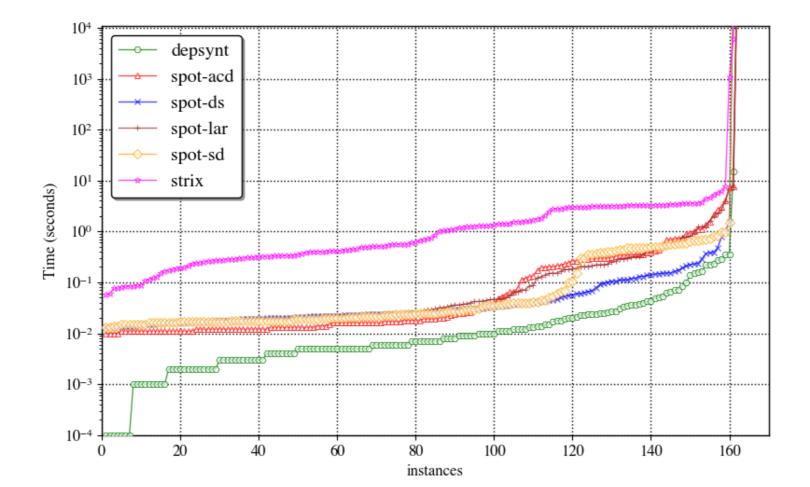


#### **DepSynt Overview**

- We implemented the synthesis pipeline in a tool called <u>DepSynt</u>.
- DepSynt is developed in C++ using Spot [Duret-Lutz. '14] and our own implementation.
- Time for dependency-check is limited to 12 seconds.
  - Decided based on empirical results.
- We compared DepSynt with Ltlsynt (Spot) [Michaud, Colange, 2018] and Strix [Meyer, Sickert, Luttenberger 2018].

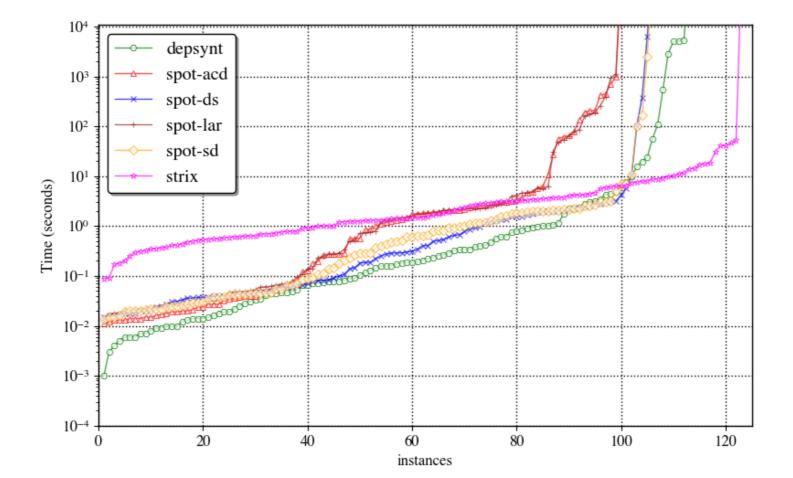
# Non-dependent vars ≤ 3

- In benchmarks with at most 3 non-dependent variables.
- DepSynt outperforms state-of-the-art tools.



# Non-dependent vars > 3

- In benchmarks with at more than 3 non-dependent variables.
- DepSynt is comparable with the other tools.

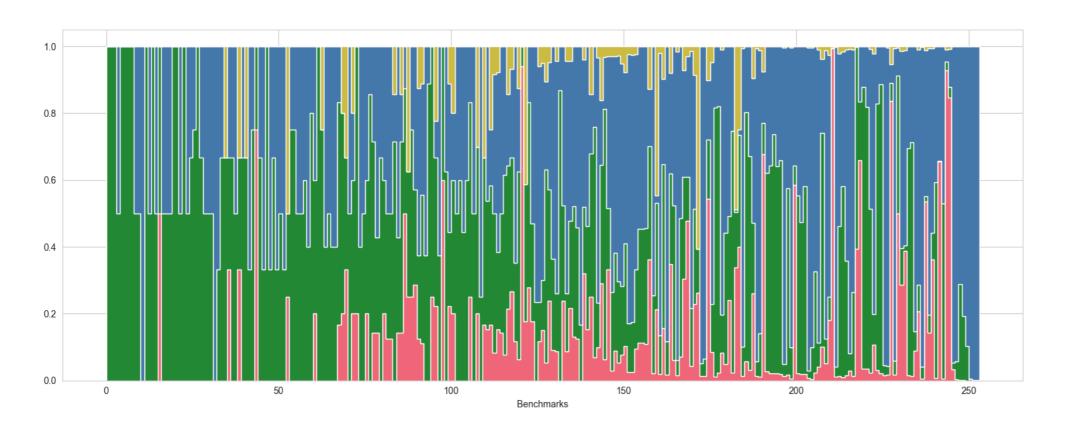


# **DepSynt - Time distribution**

- How long DepSynt is spending on each phase normalized.
- The benchmarks are sorted by total duration.

Search for dependent variables Build NBA

Synthesis non-dependent variables
Synthesis dependent variables



#### Conclusion

- Formal definition of LTL dependency.
- Algorithm to find dependent variables.
- Framework that utilizes dependency for Reactive Synthesis.
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- DepSynt confirms the dependency benefits.
- Future work: exploring more general notions of dependency.