# Pragmatic model checking: from theory to implementations

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Fraditio et Innovatio



### How does a model checker work?

# How to build an effective model checker?

# How to use a model checker pragmatically?



#### How does a model checker work?

# How to build an effective model checker?

# How to use a model checker pragmatically?



## Model checking in a nutshell

# 

### model checker

#### Yes (O+O+O+O) witness path)

#### ho (0-+0-+0-+0 counterexample)



## Model checking in a nutshell

# model specification



# model checker

# (O+O+O+O witness path)

# (O+O+O+O) counterexample)





# business process\* with 66 parallel branches \* modeled by IBM customers using the IBM Websphere business modeler



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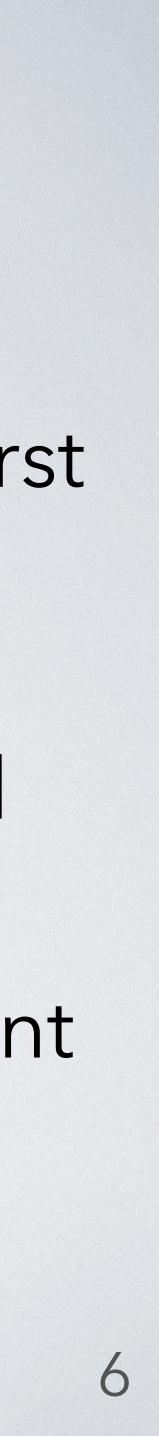


# The core algorithm

markings = []
search(m<sub>0</sub>,φ)

def search(m, \varphi):
 check(m, \varphi)
 markings.add(m)
 for t in enabled(m):
 m' = fire(m, t)
 if not m' in markings:
 search(m', \varphi)

- search is a simple depth first search (+ SCC detection)
- **check** depends on the nature of the property and may terminate search
- enabled and fire implement the Petri net firing rule



## **Reduction techniques**

- apply theoretic results to
- 1. store fewer markings
- 2. fire fewer transitions / generate fewer markings
- 3. store markings more efficiently



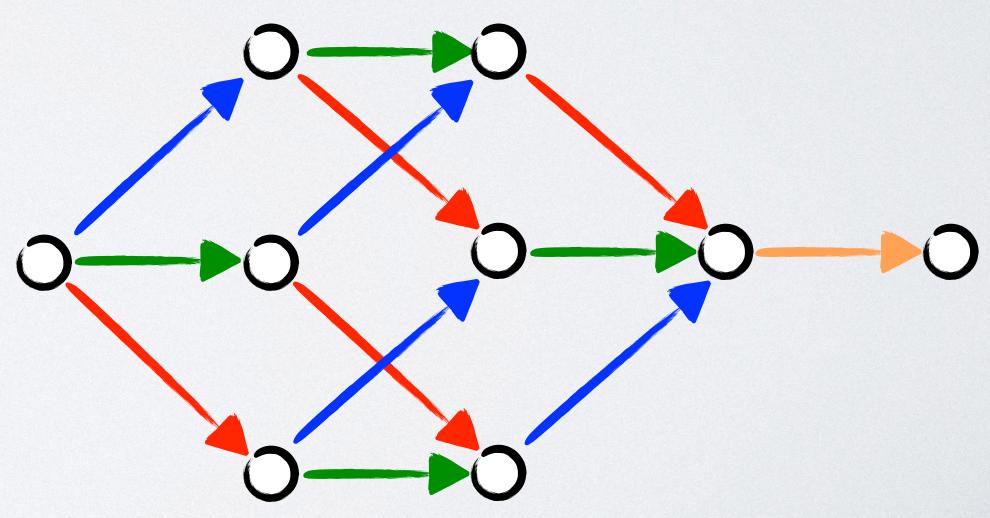
### while preserving the property



observation: concurrent transitions can be fired in **any order**, yielding the same final state

idea: fix one ordering by **postponing** the firing of some transitions

implementation: search on Petri net structure

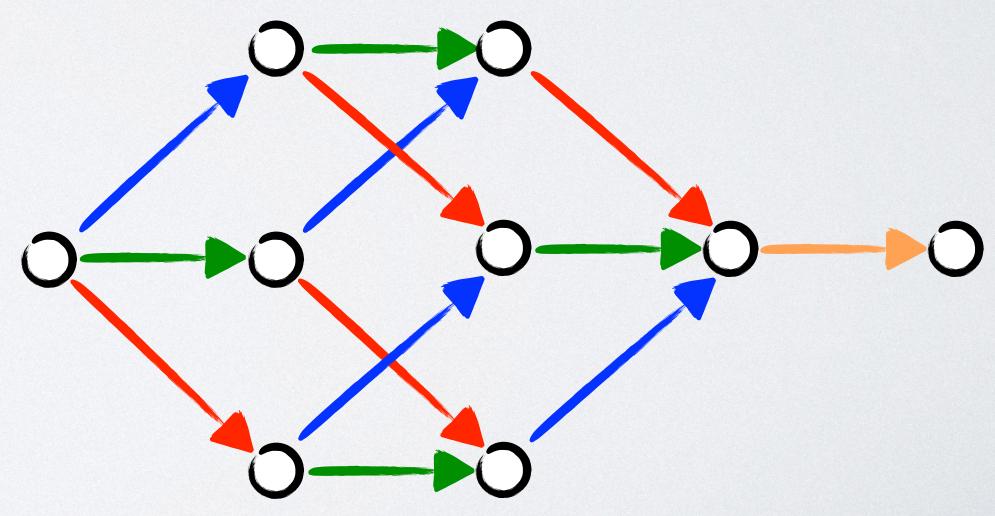




algorithm (sketch):

- choose one activated transition
- until fixed point is reached: add all conflicting transitions



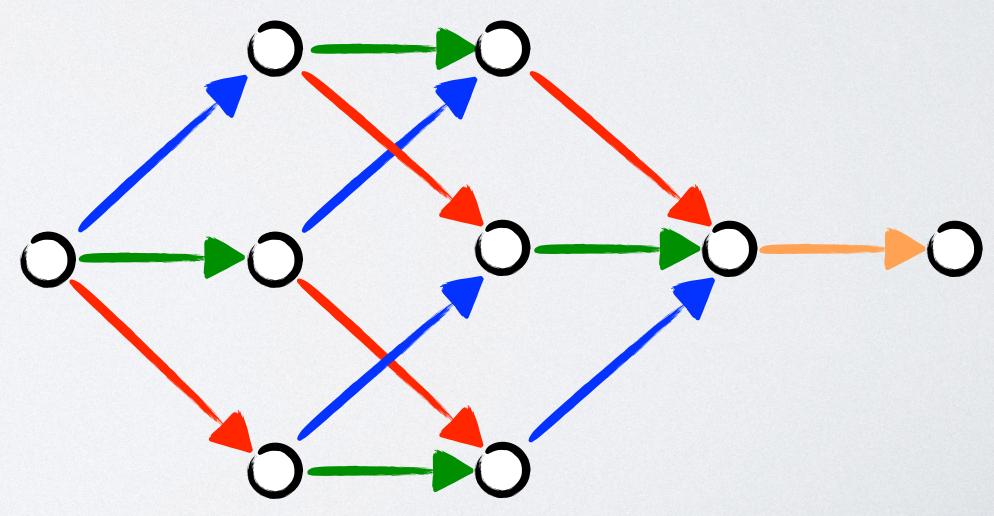




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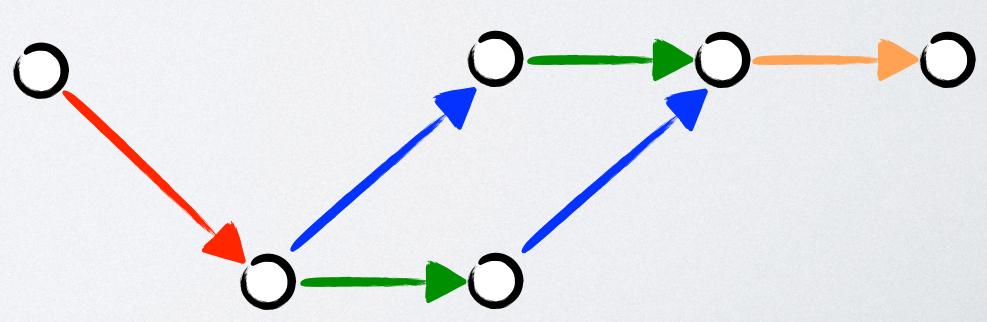






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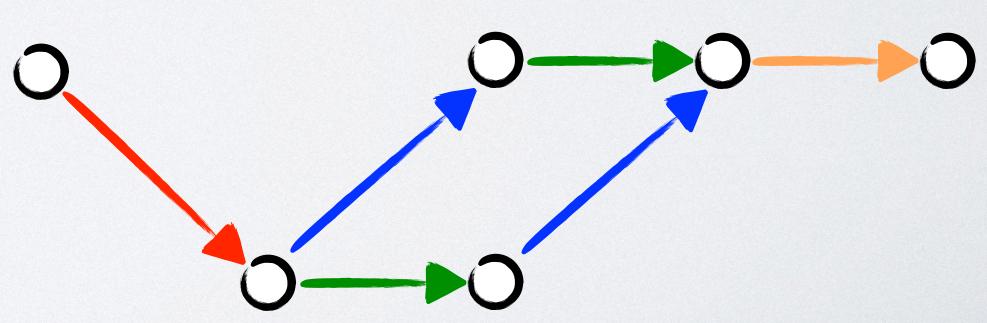
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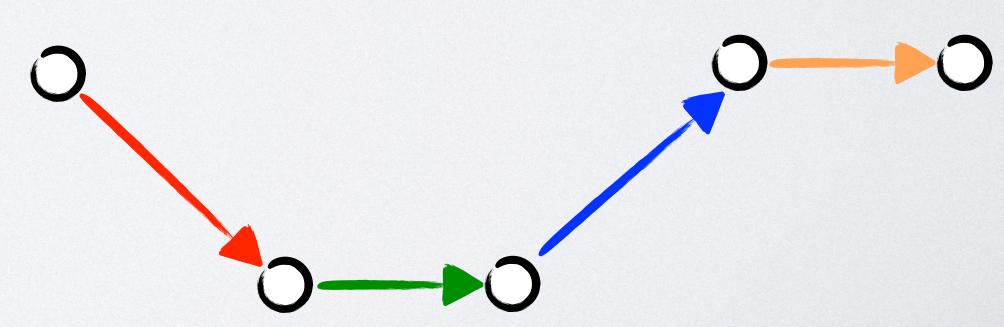




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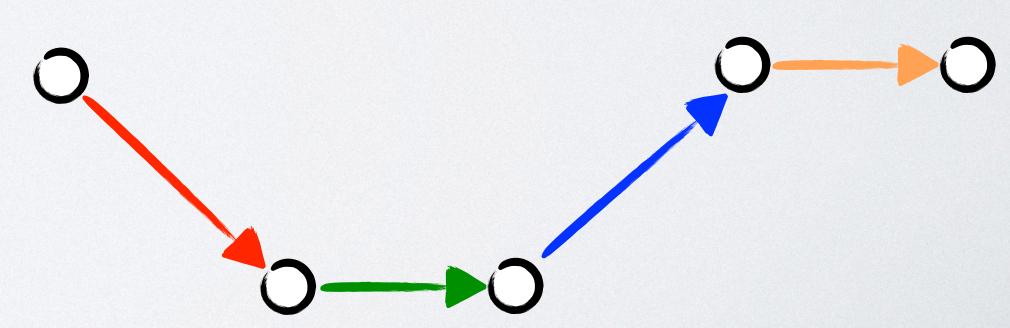




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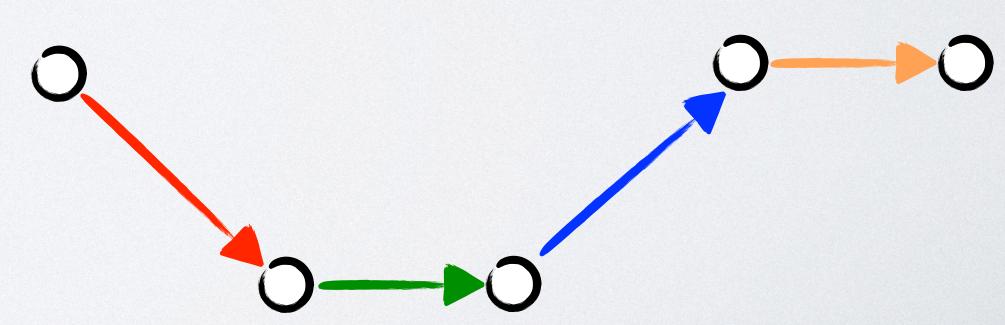




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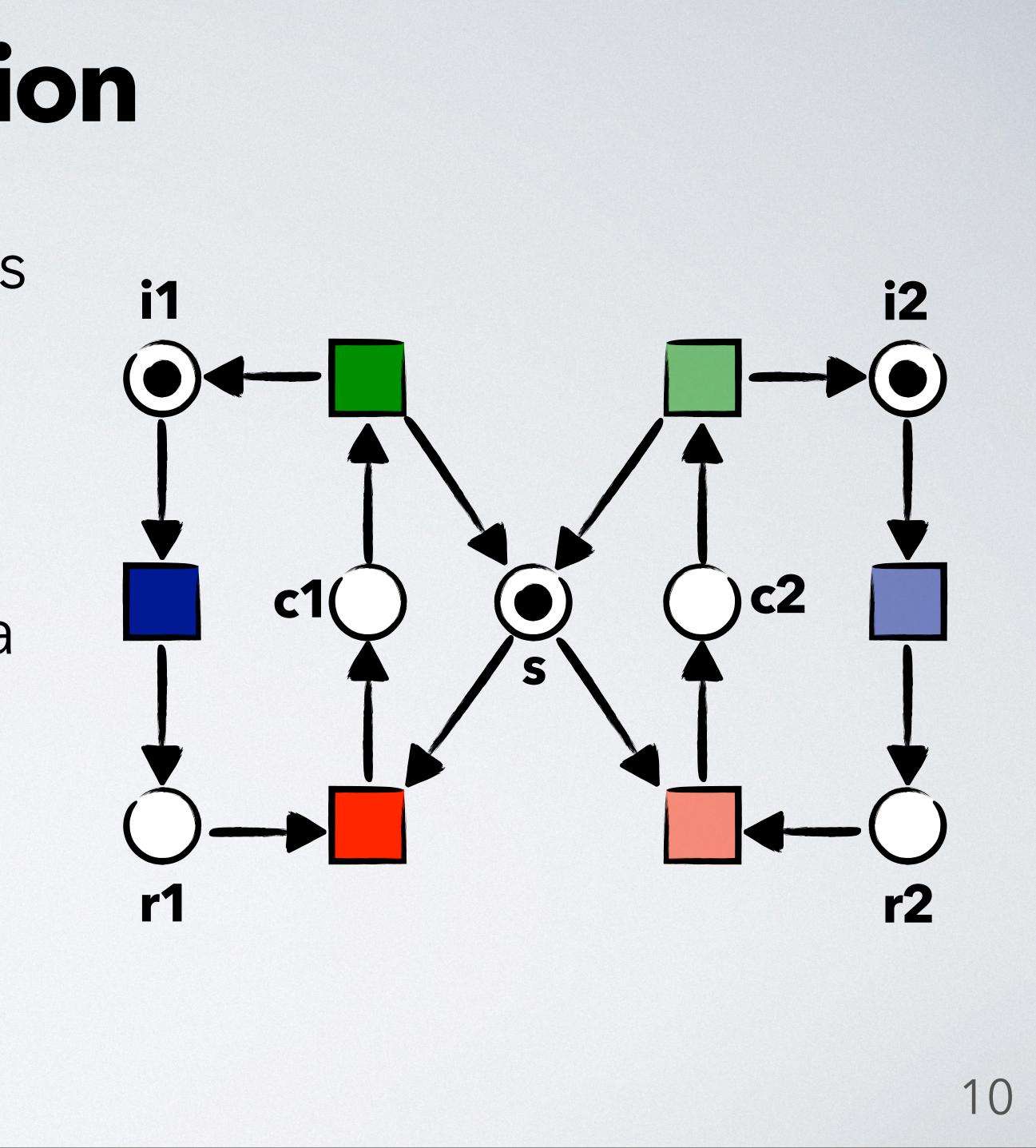


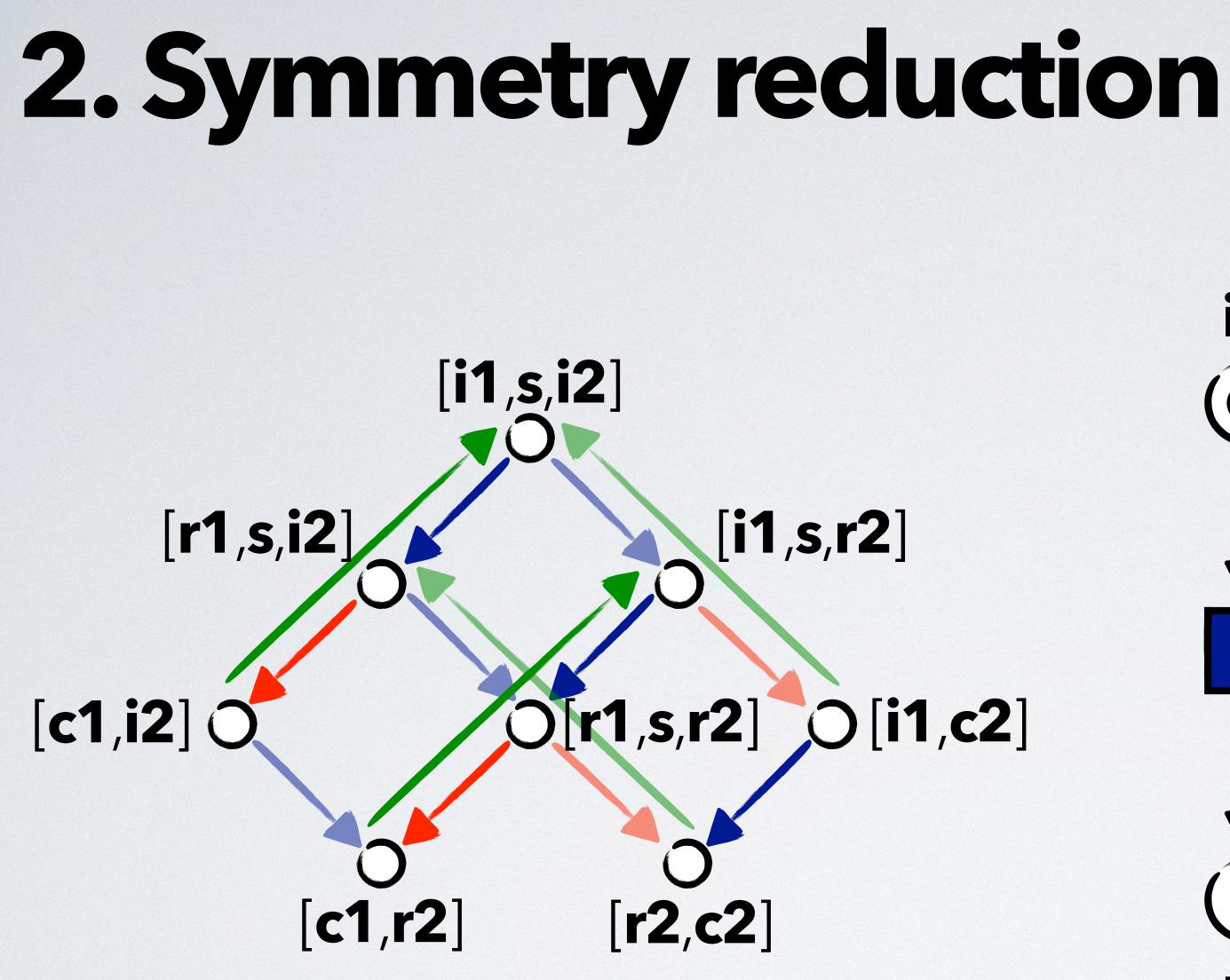
# 2. Symmetry reduction

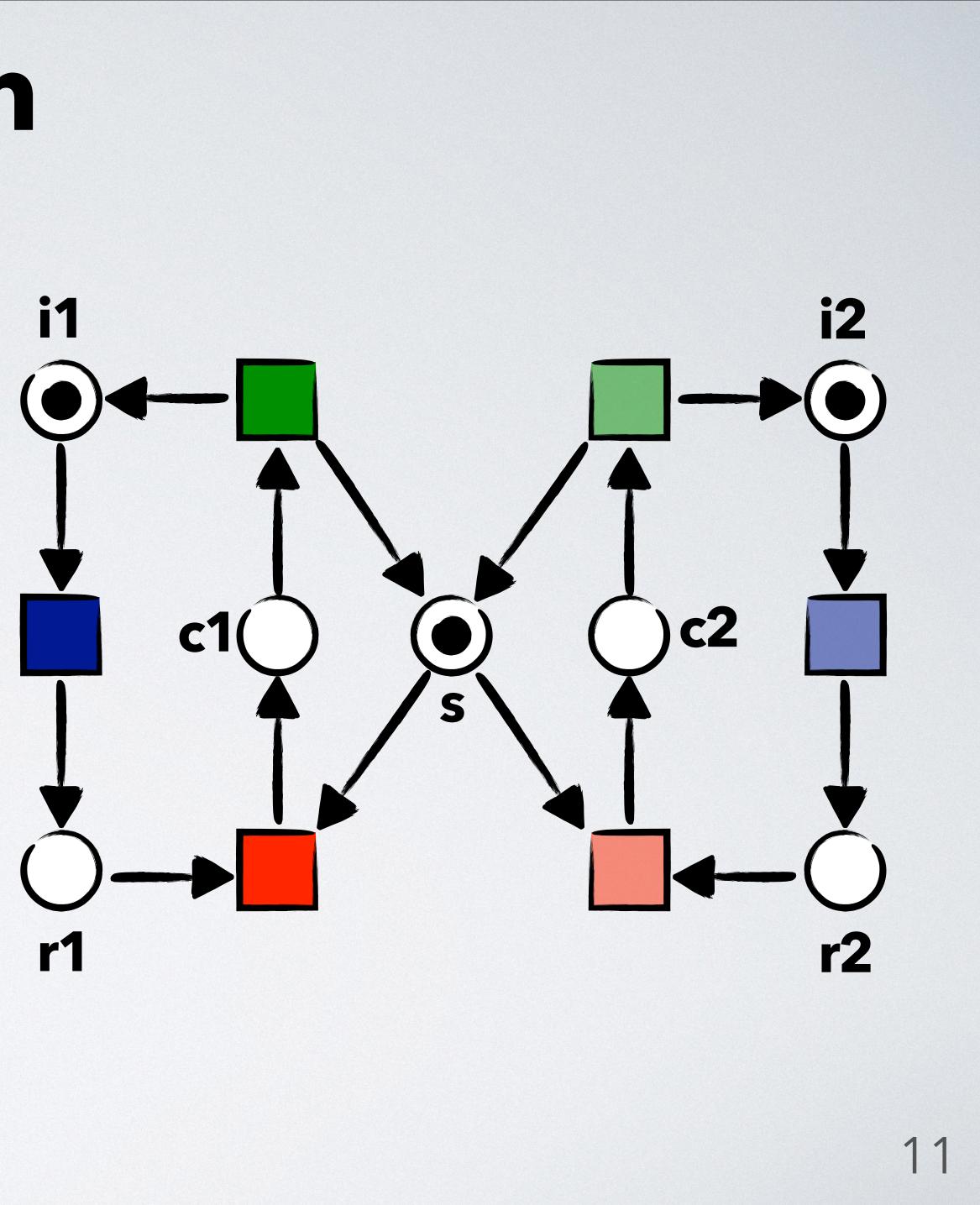
observation: symmetric models (e.g. due to copies of components) have symmetric behavior

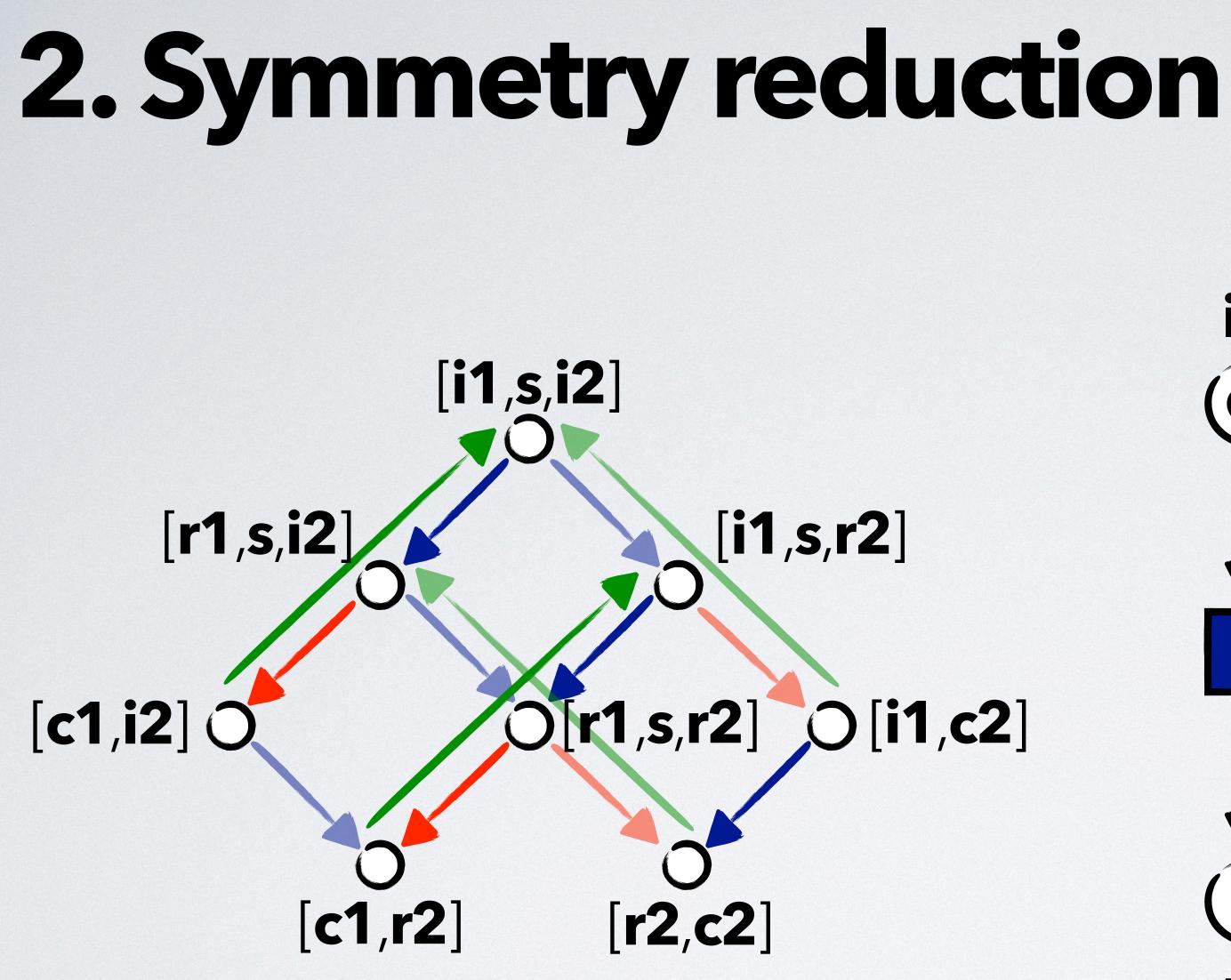
idea: do not store markings if a symmetric copy is already stored

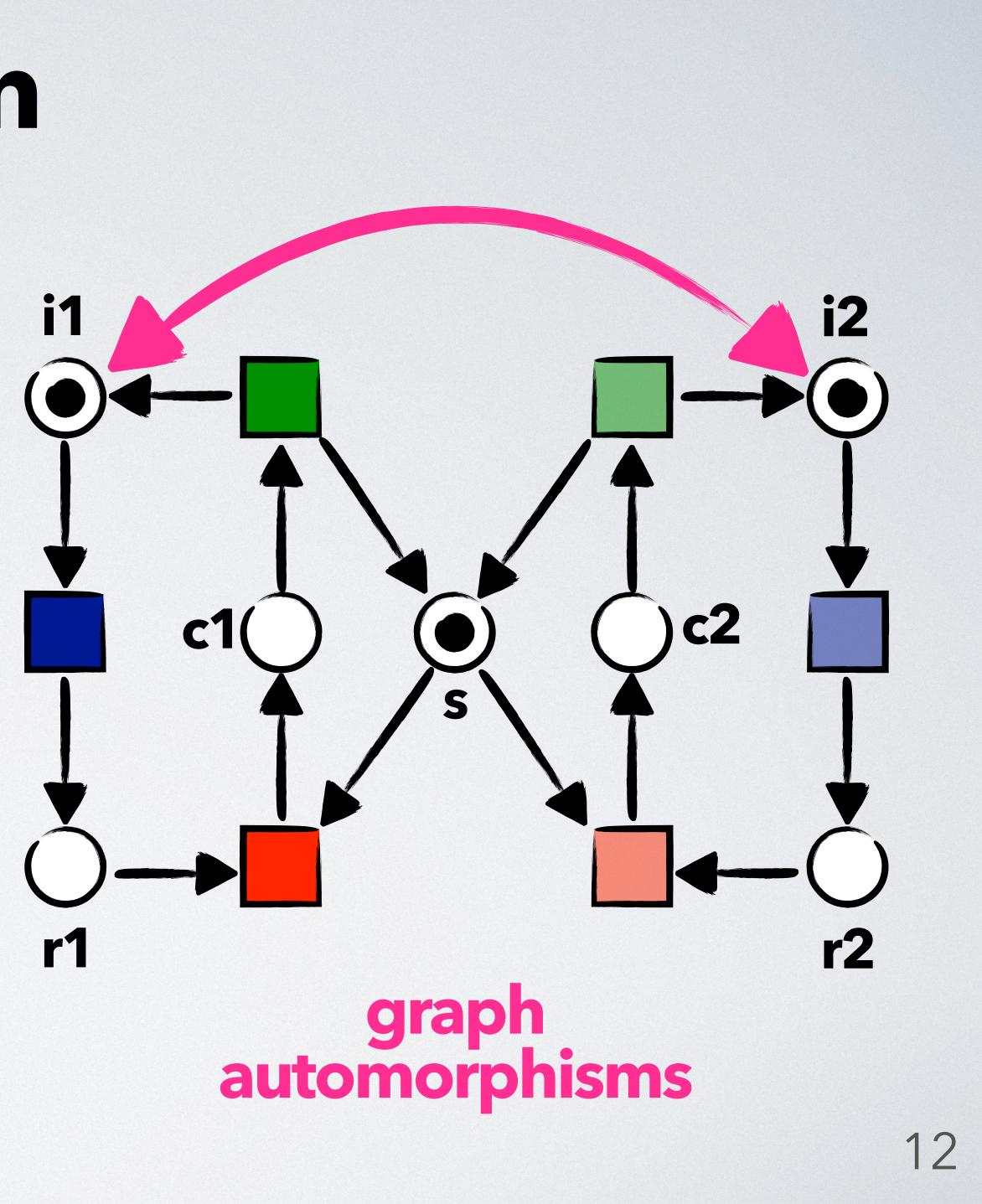
implementation: Petri net graph automorphisms

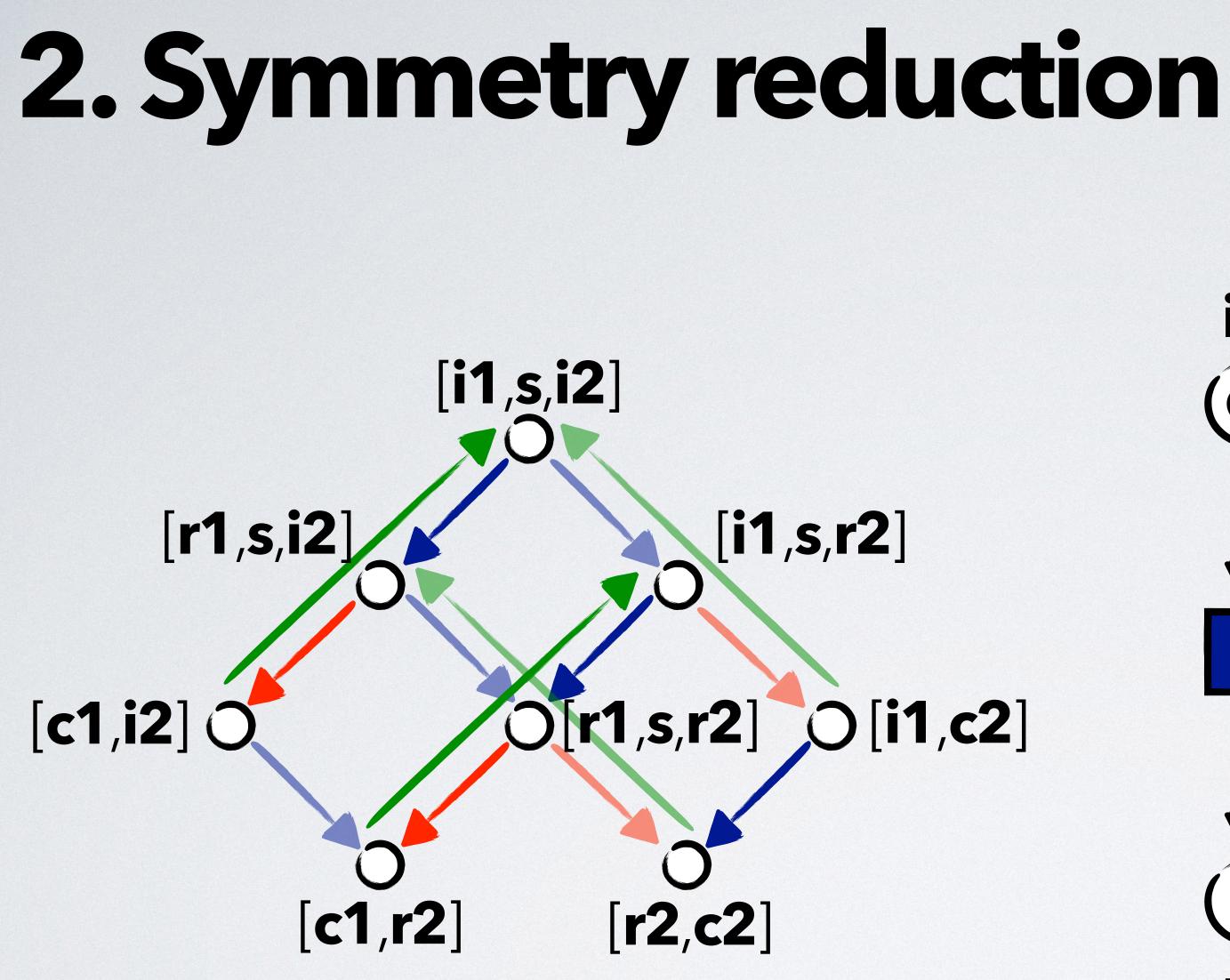


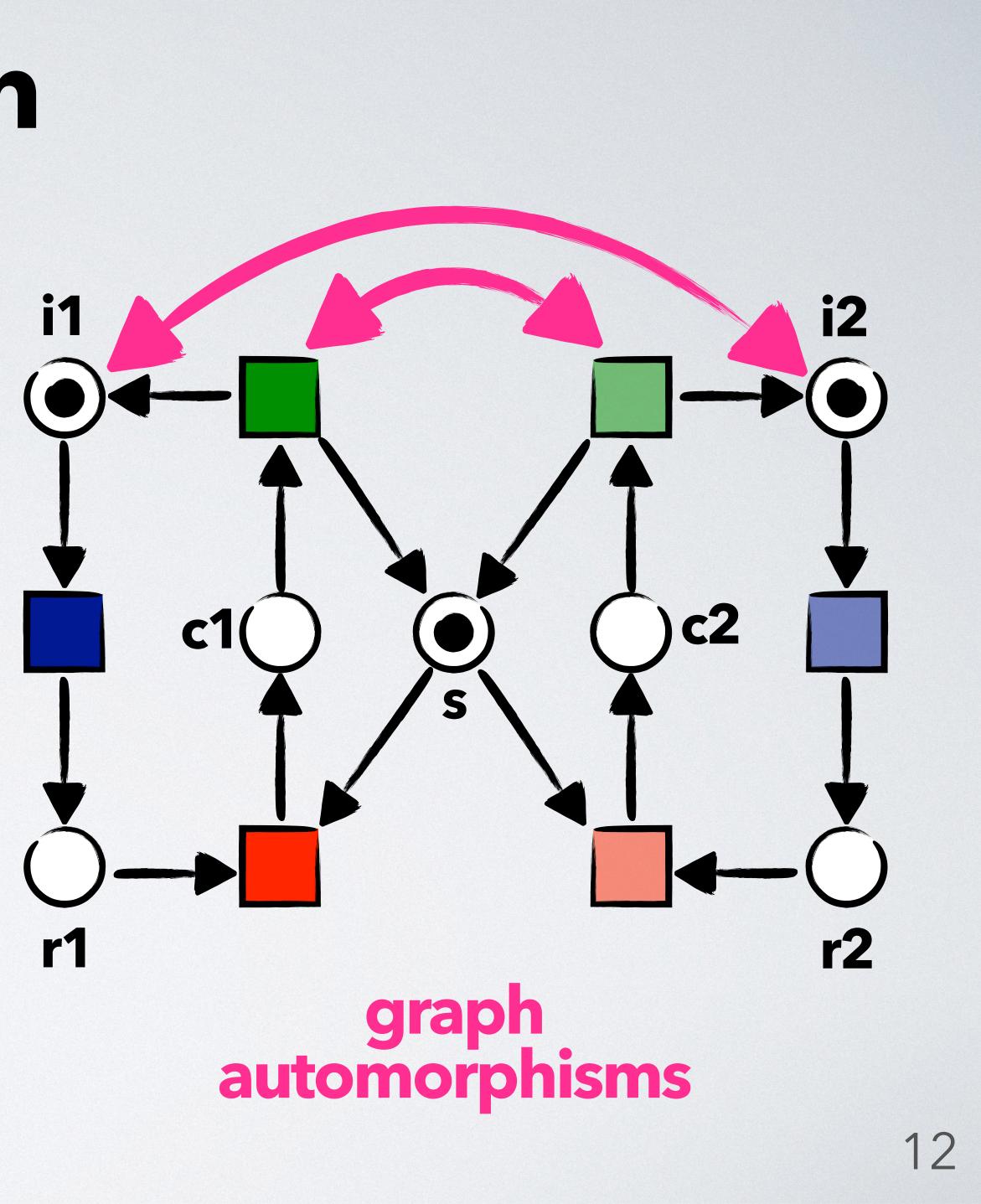


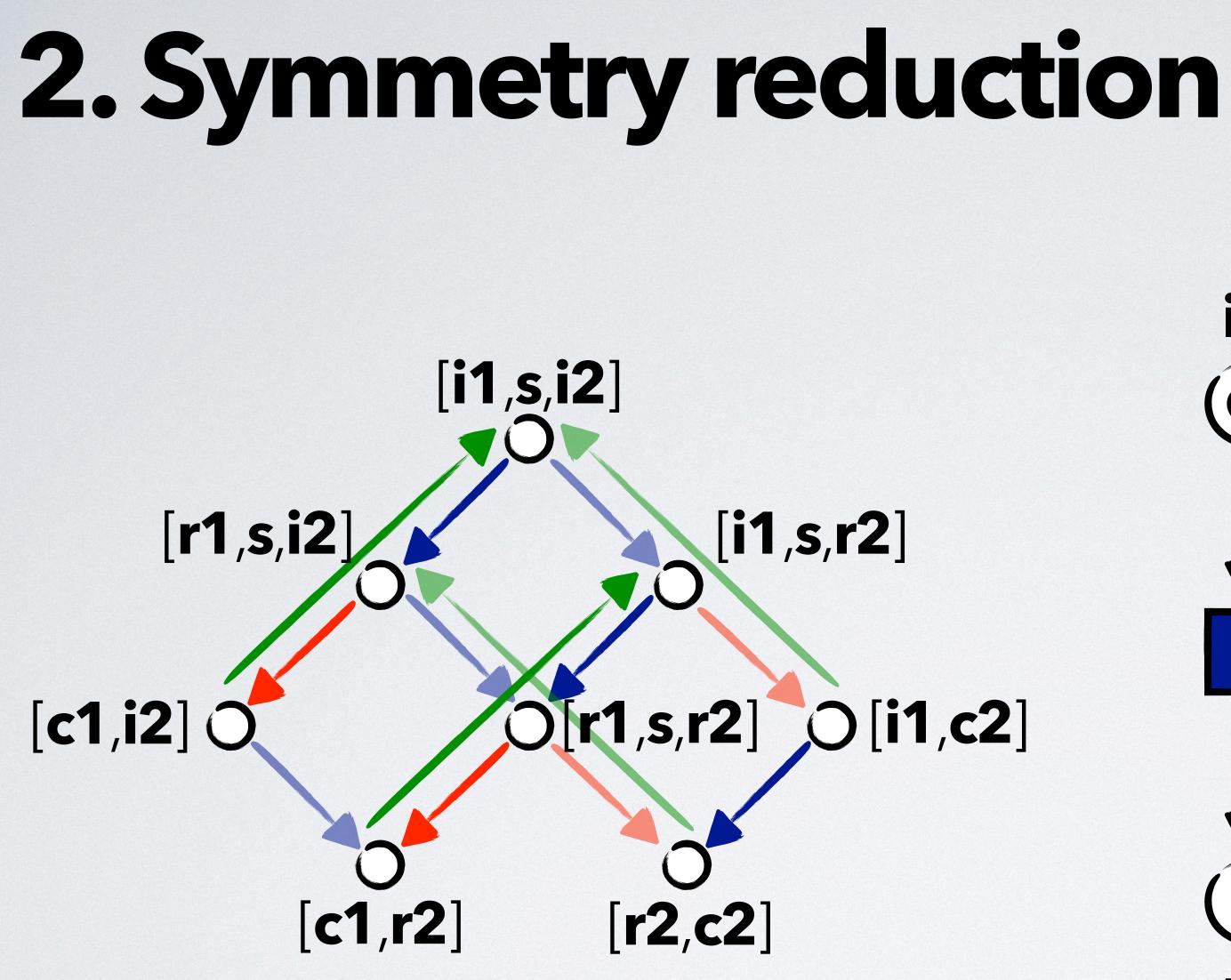


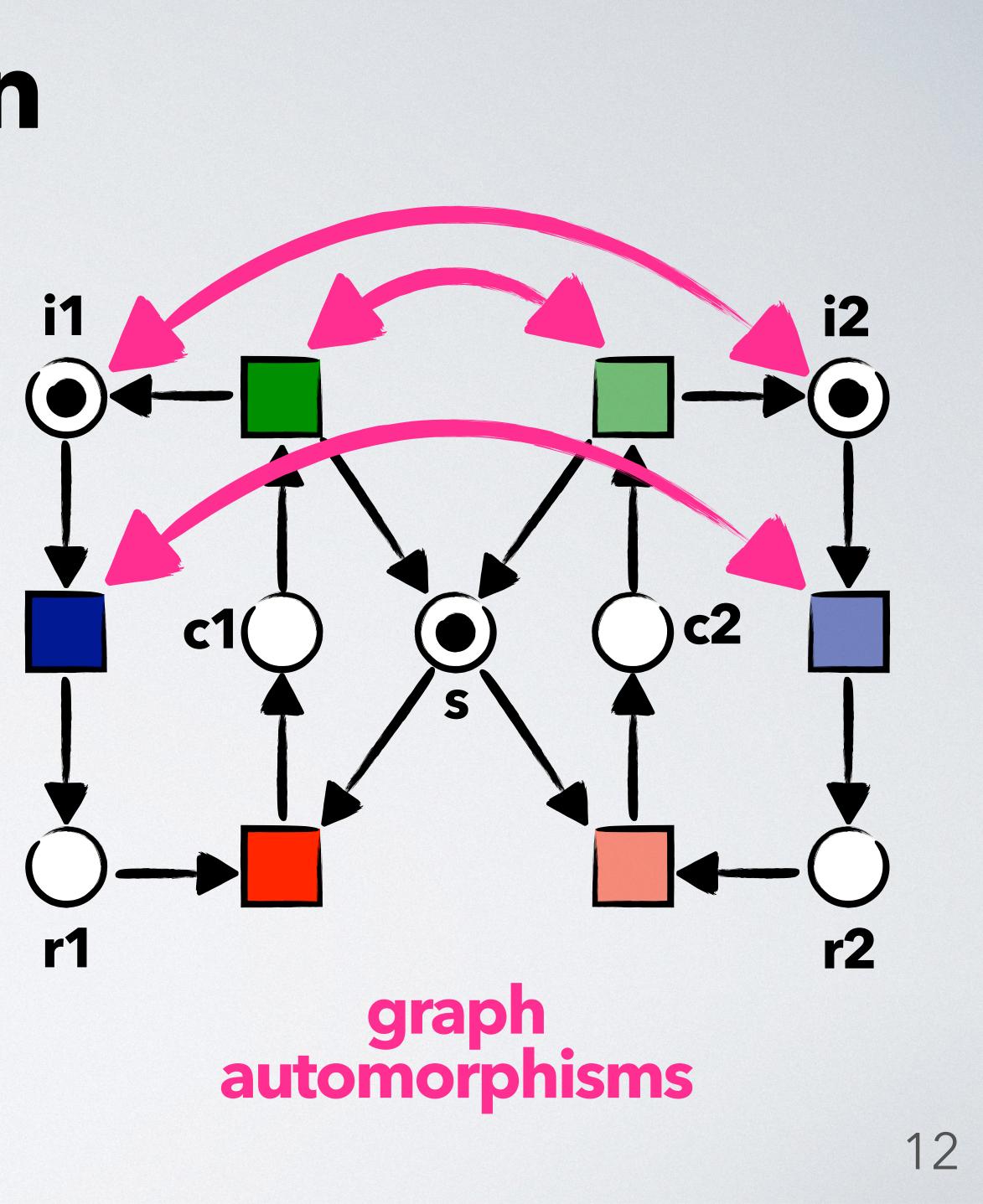


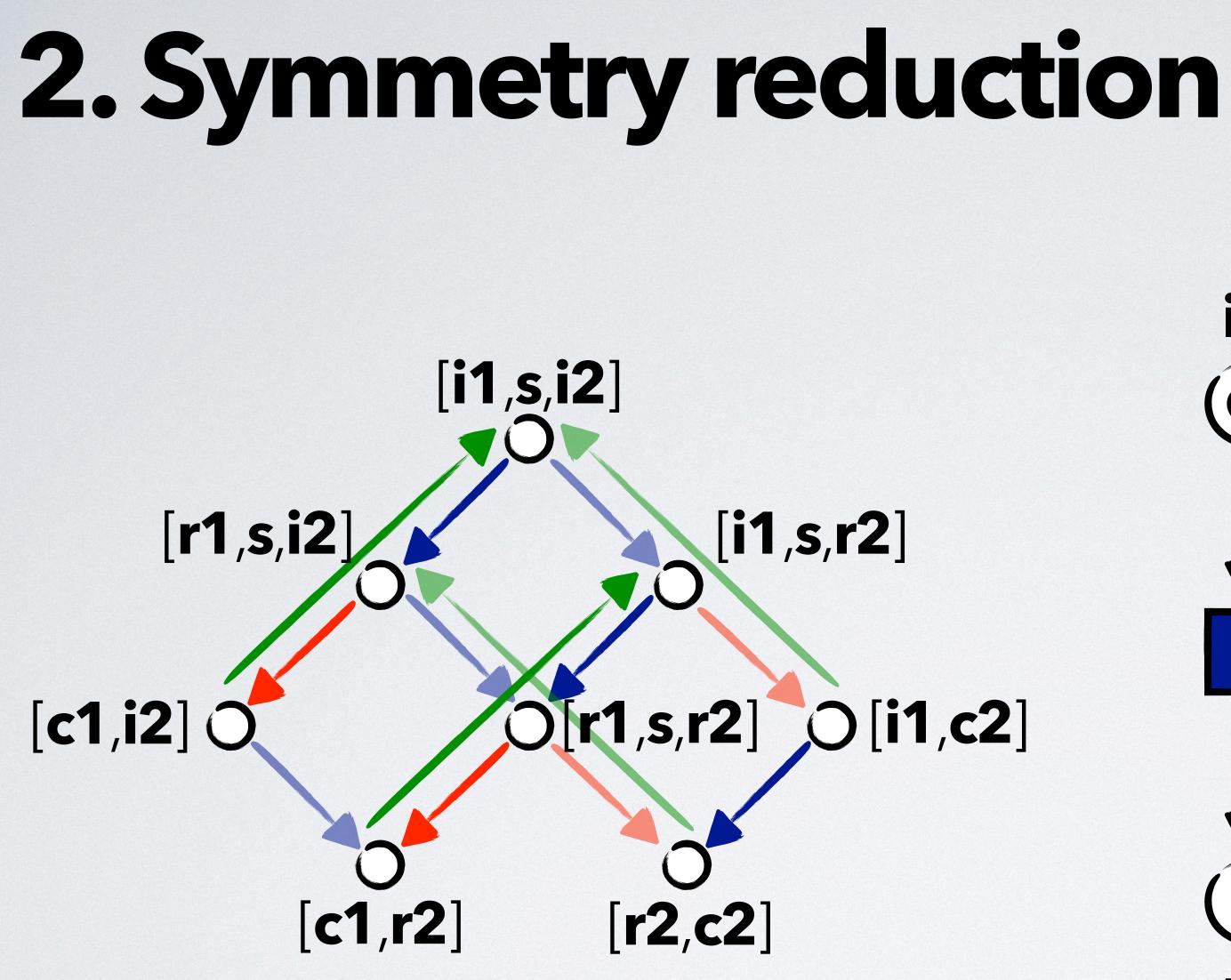


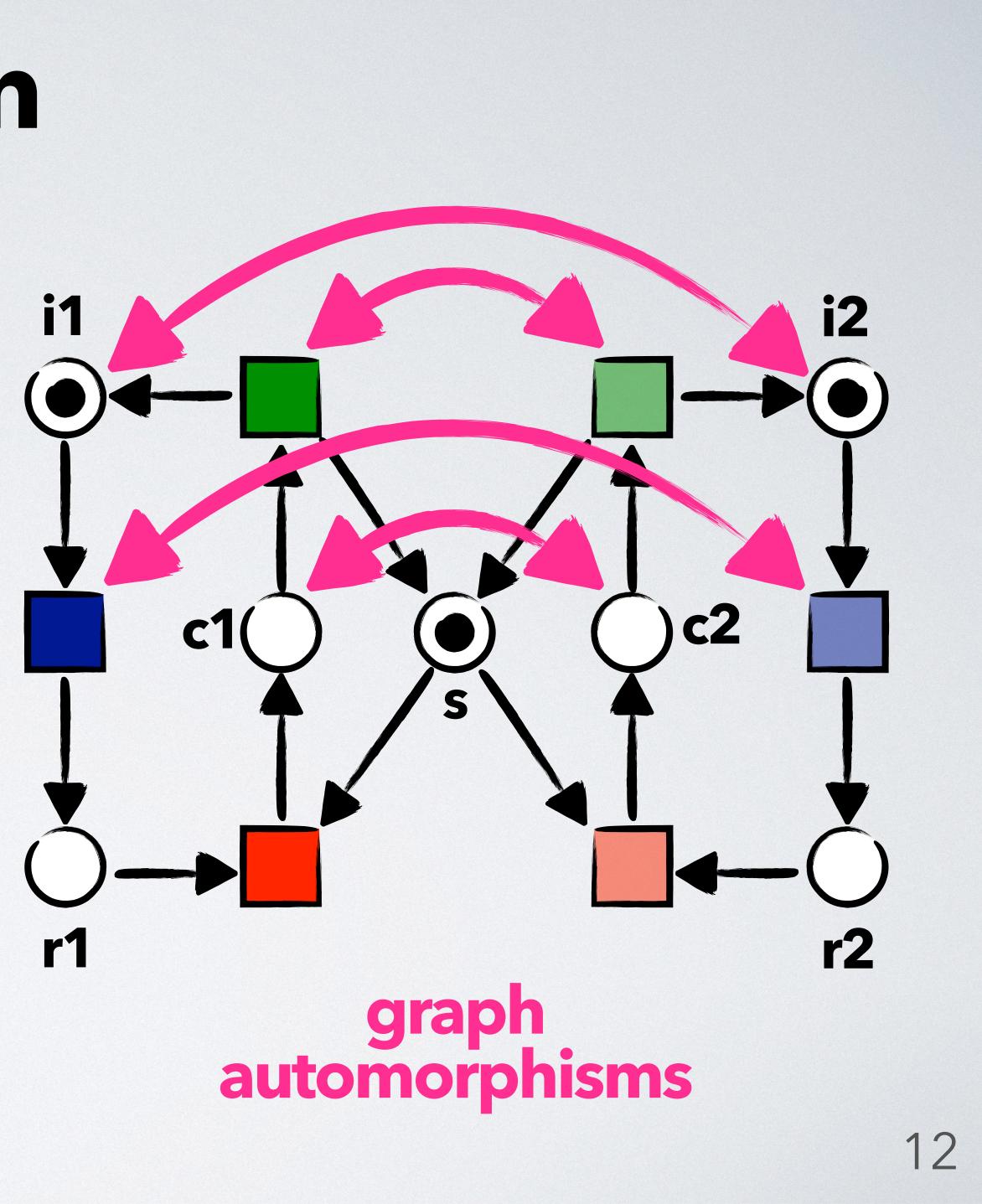


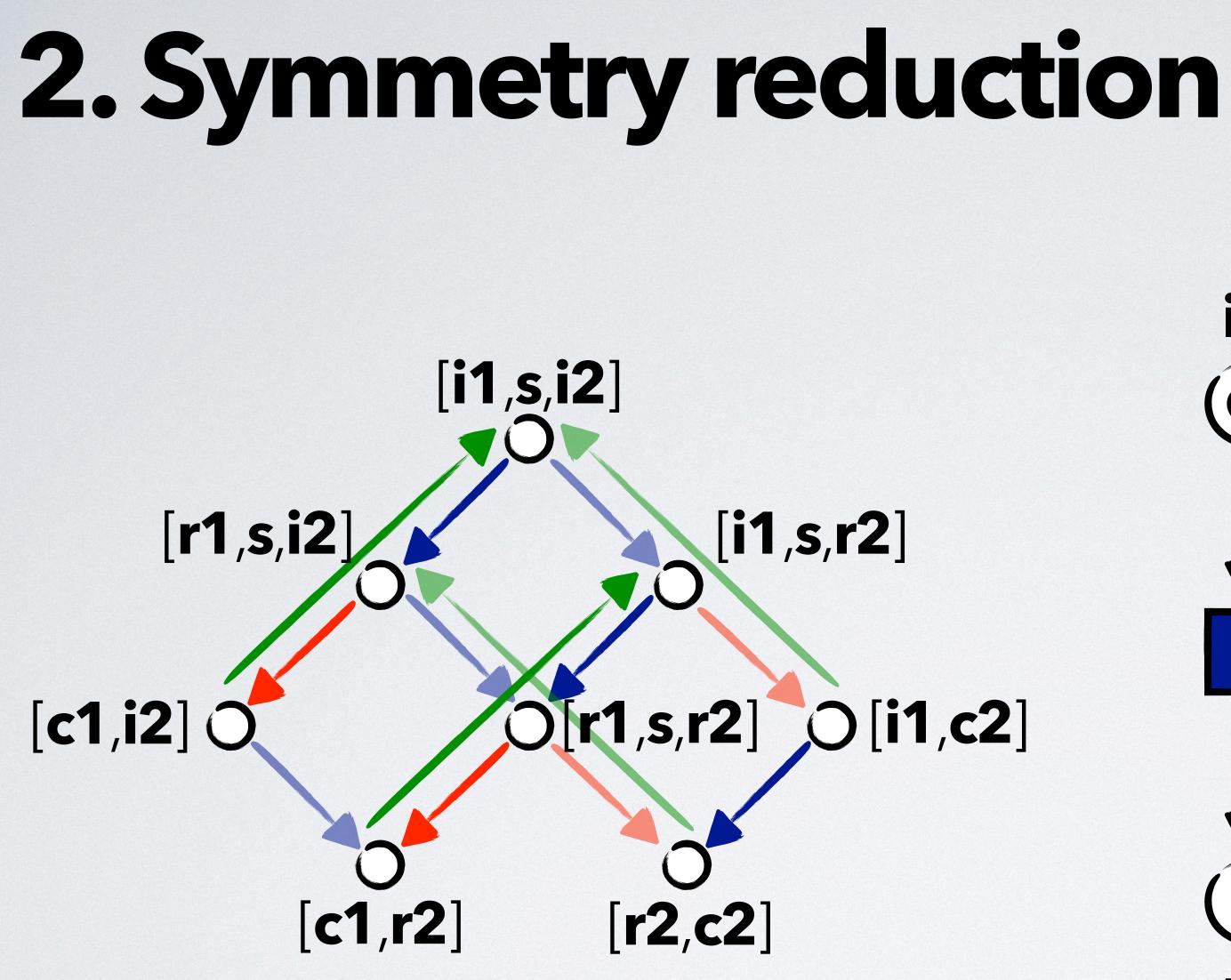


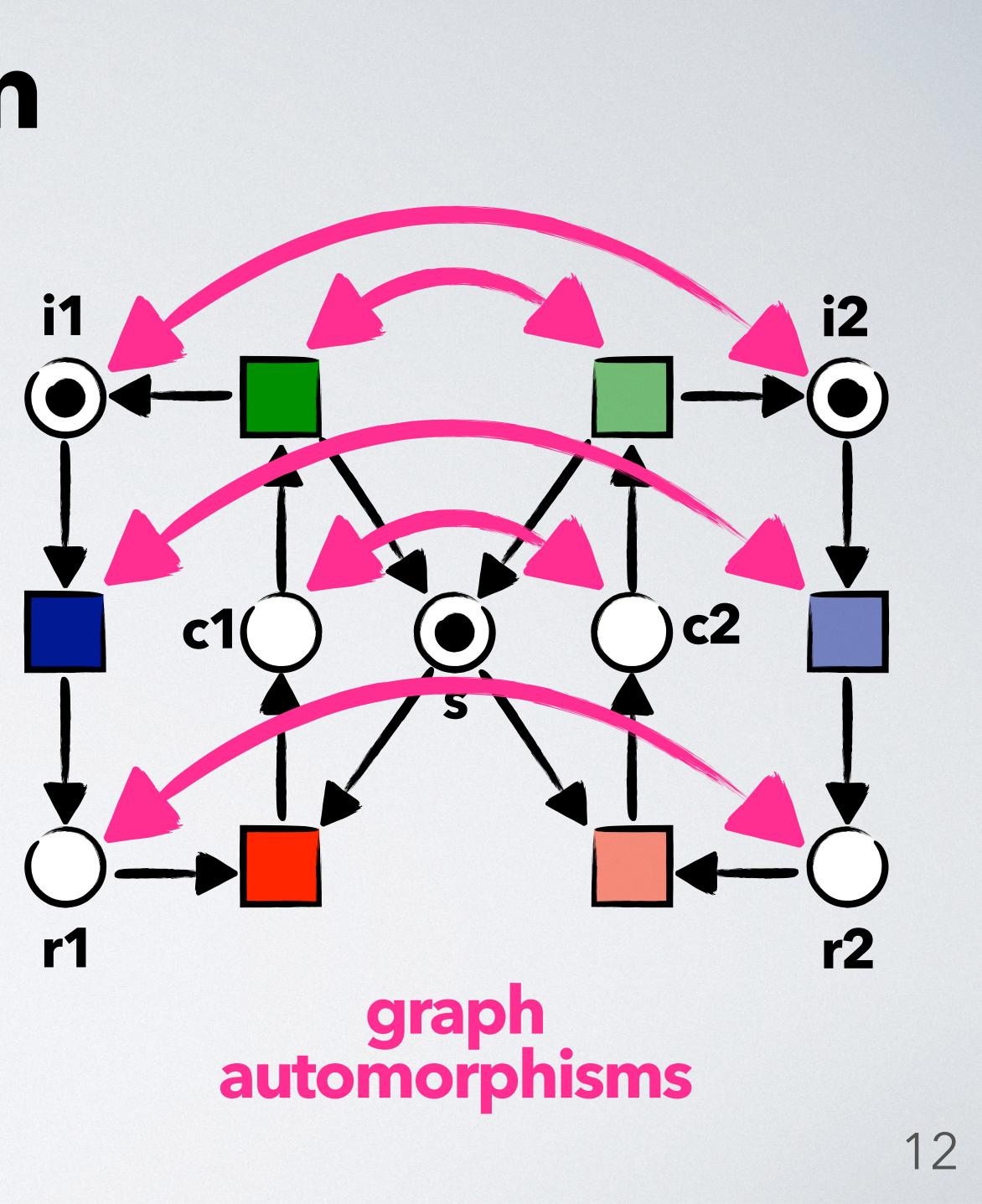


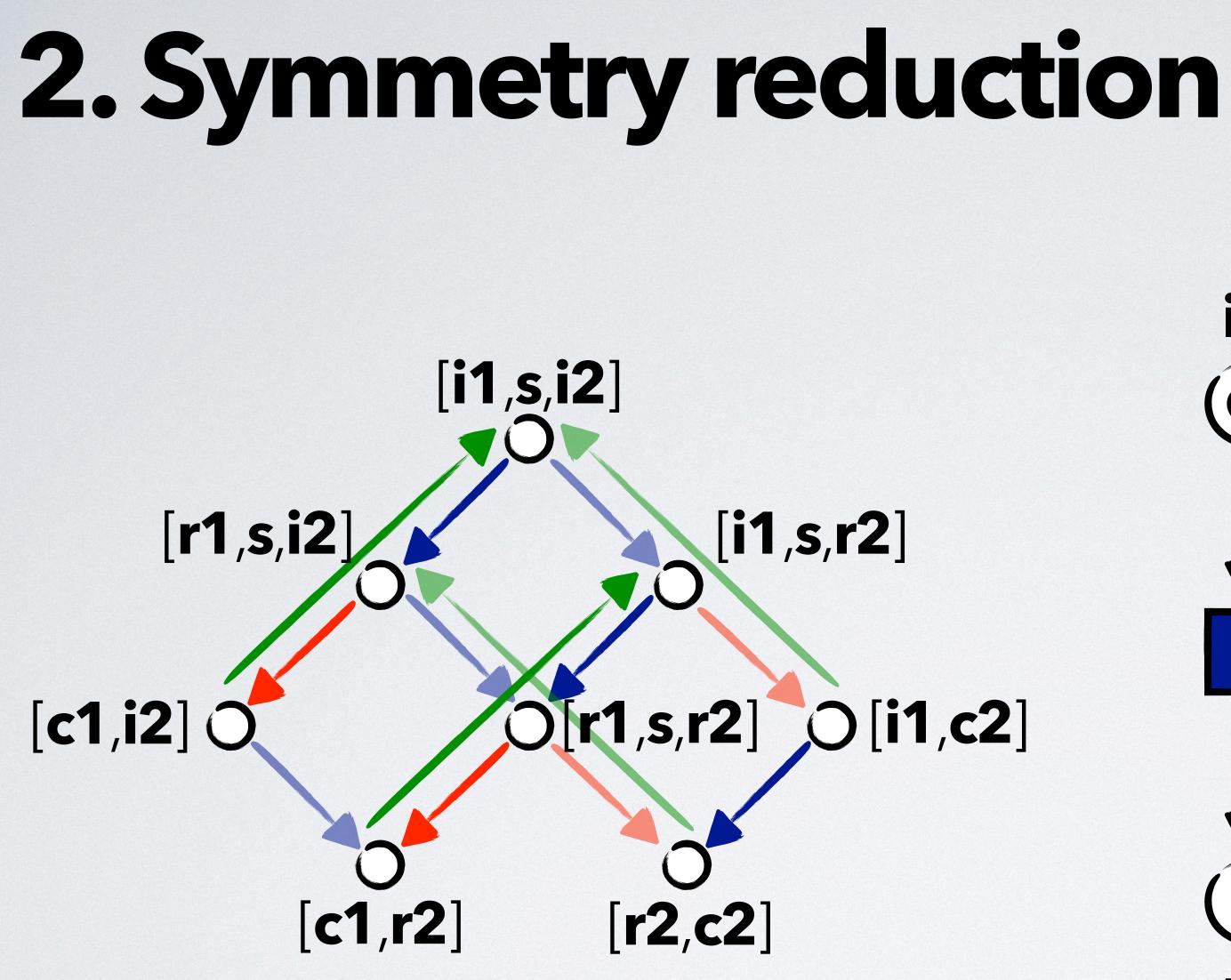


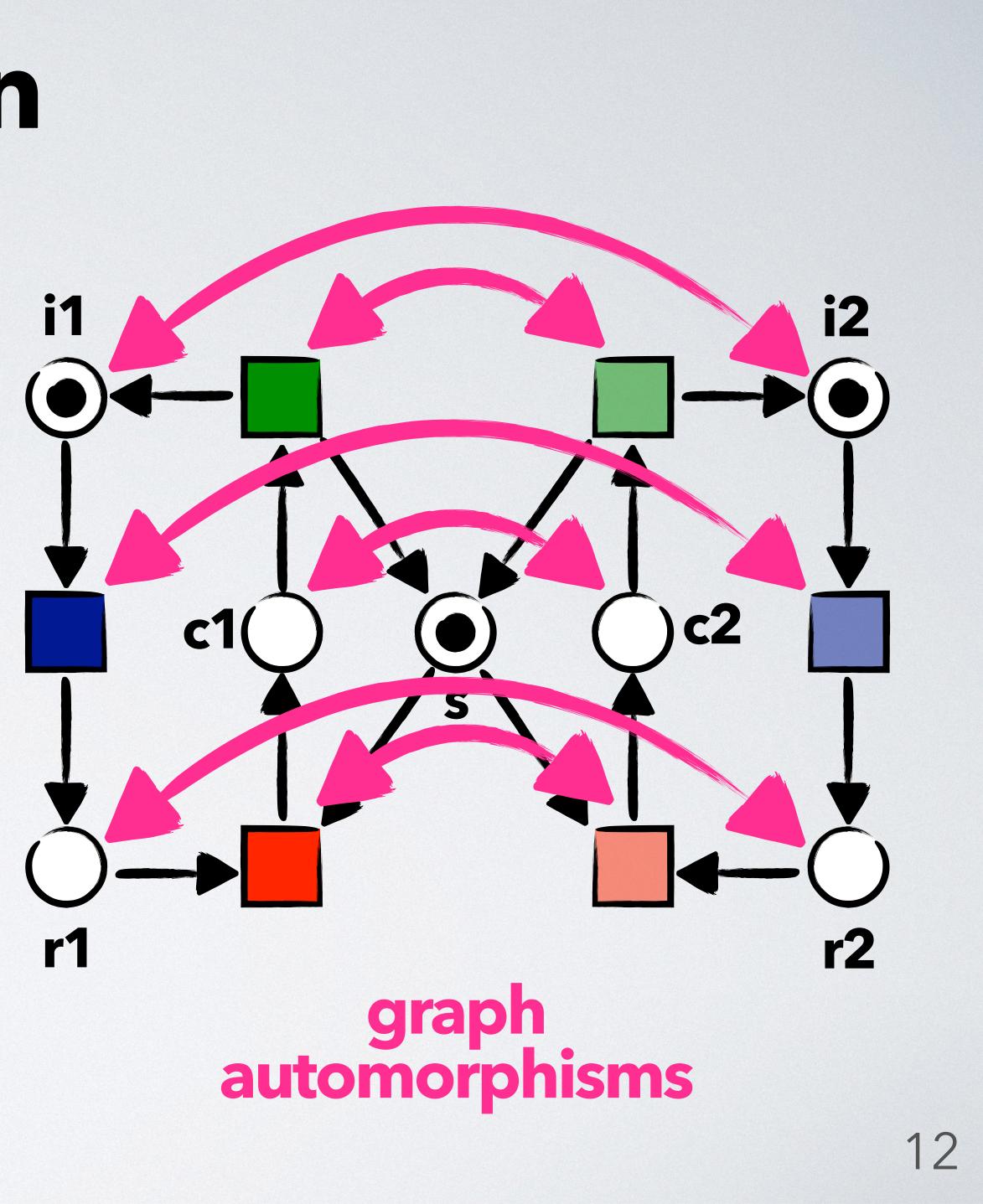


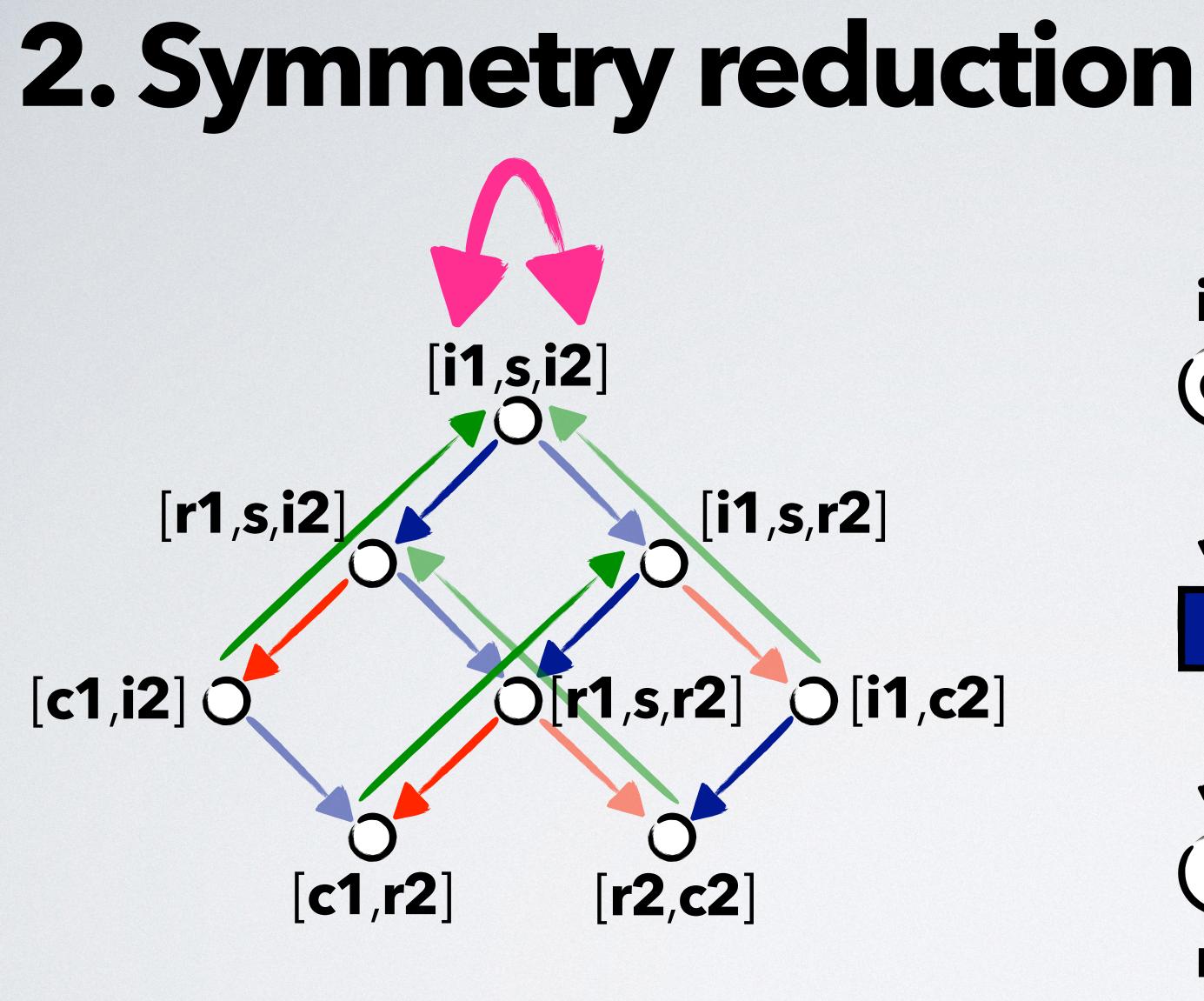




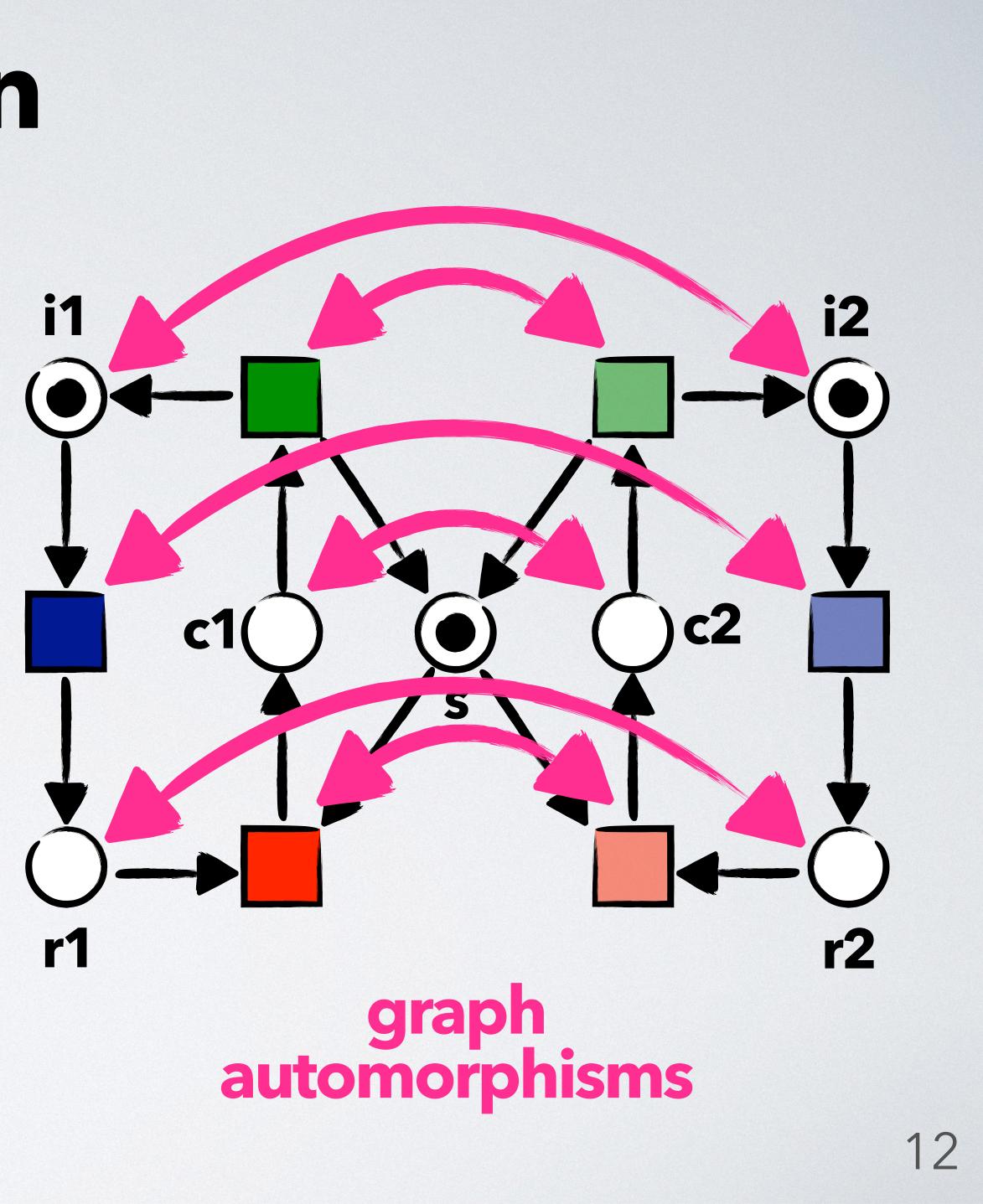


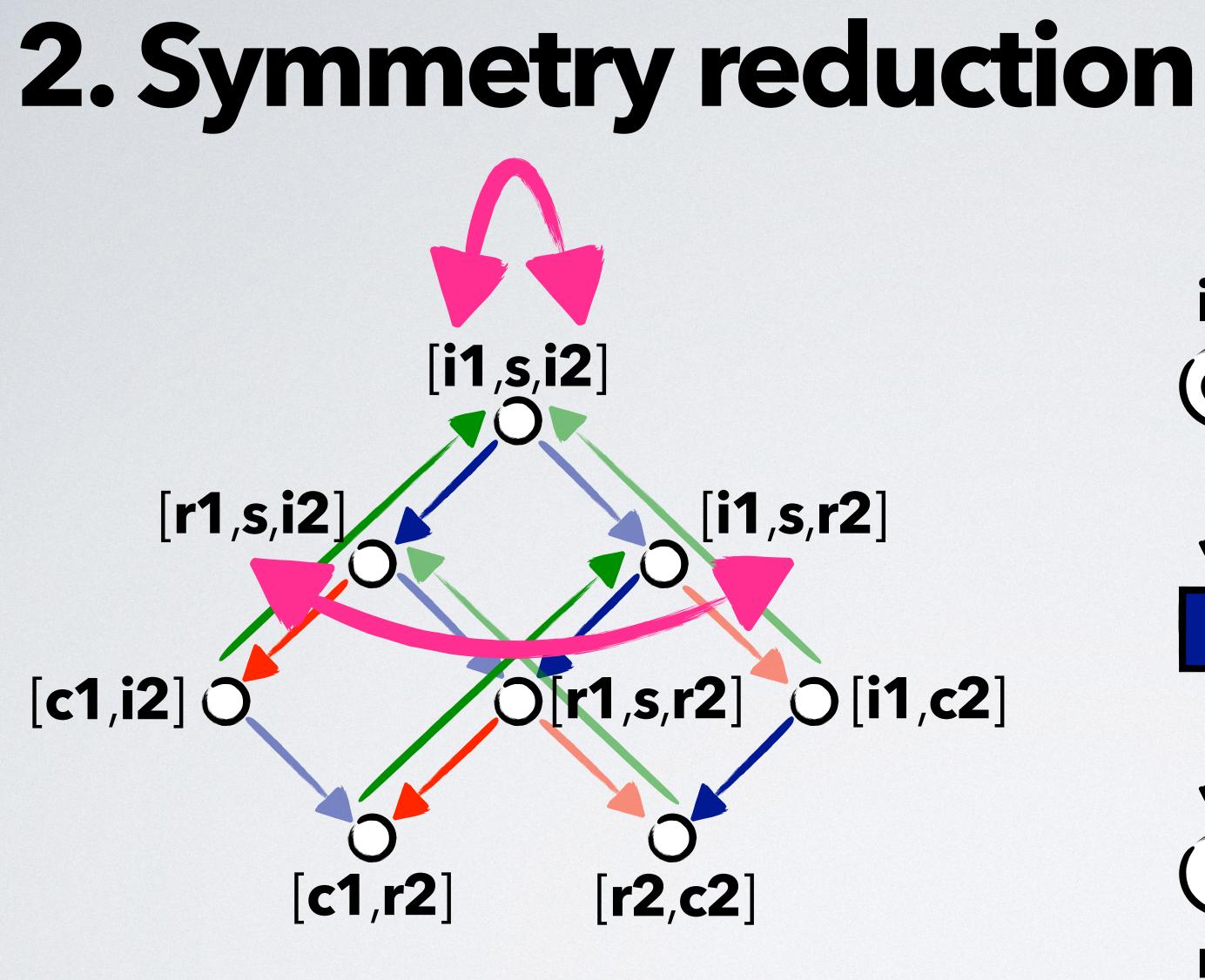




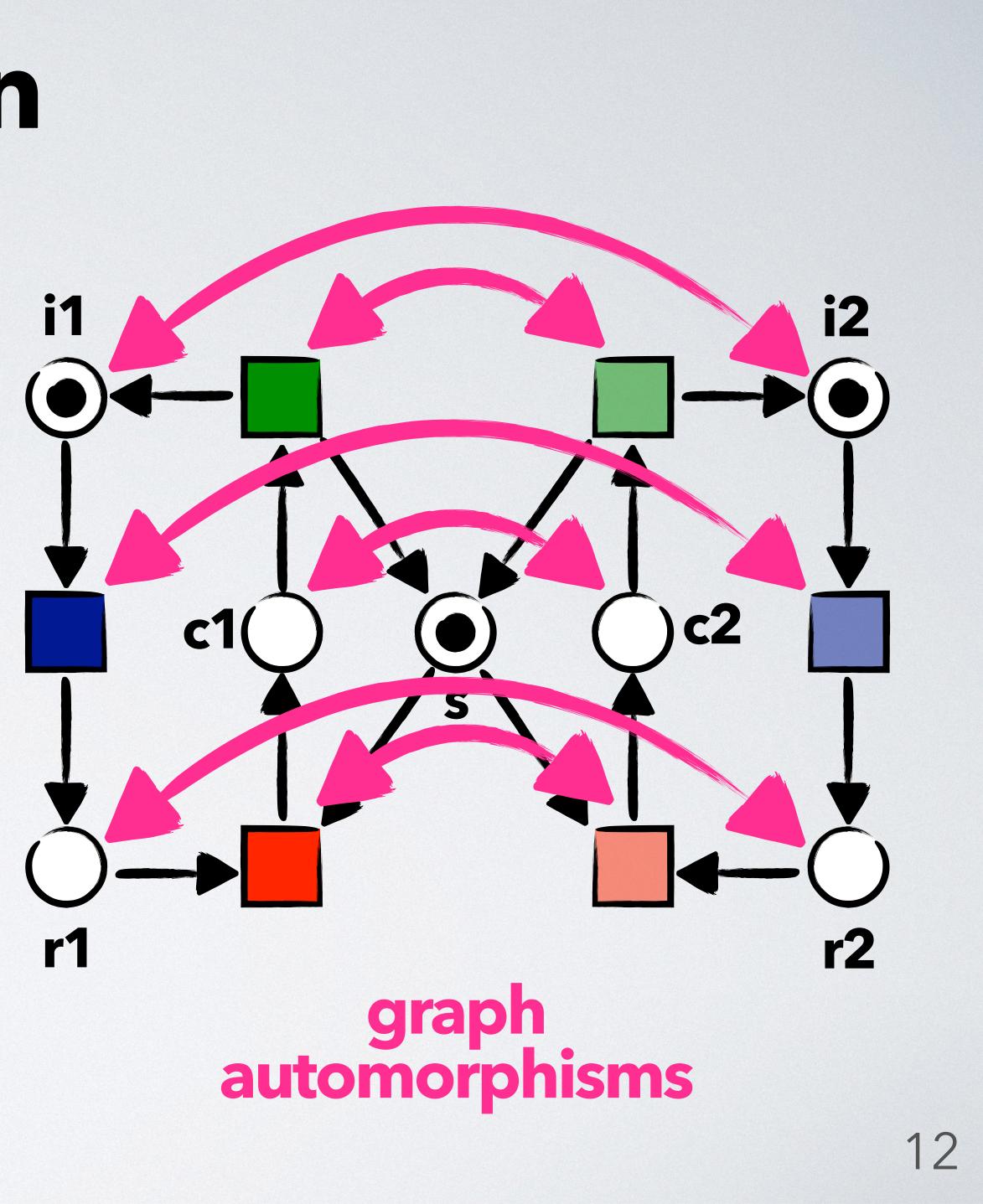


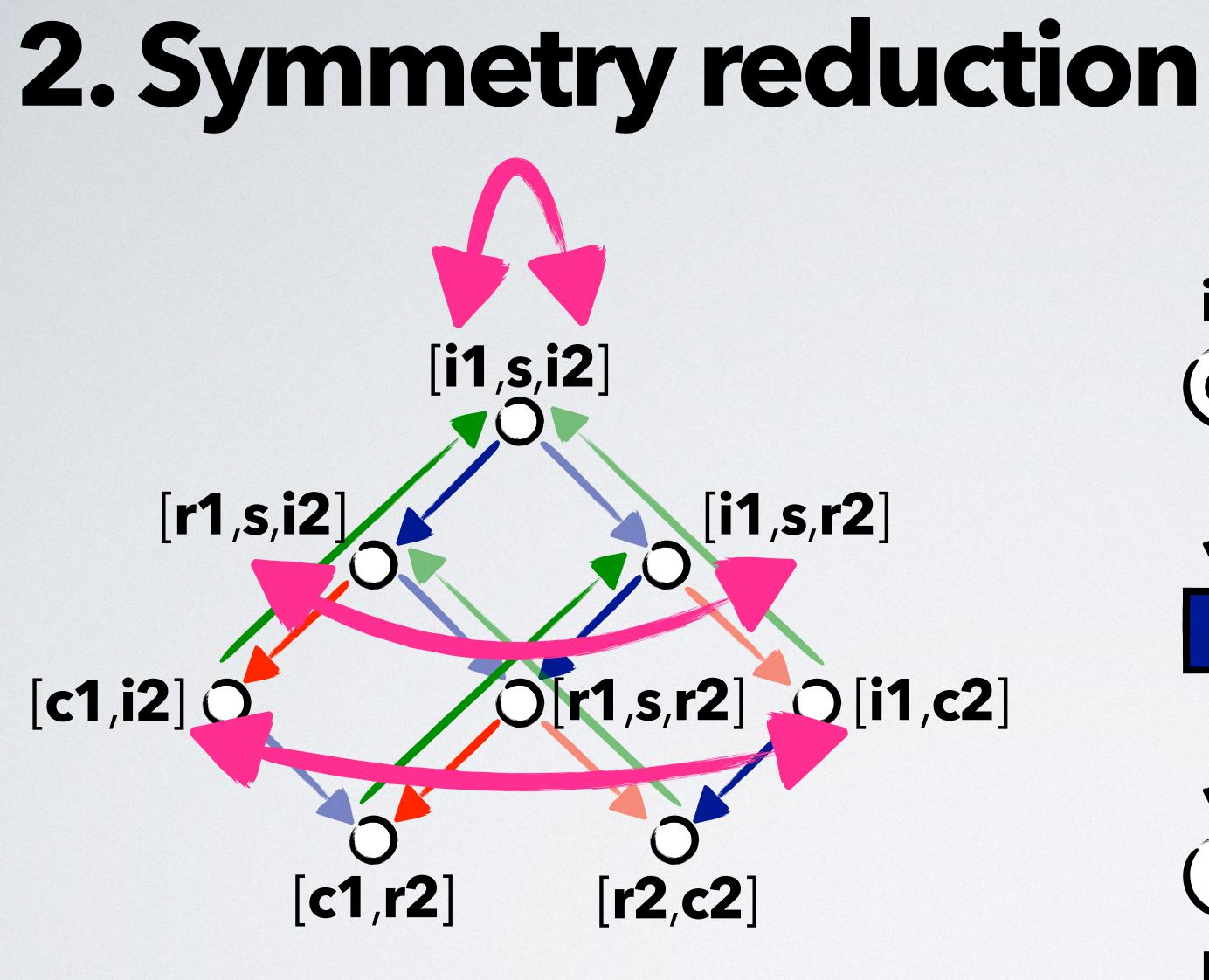
#### symmetric markings



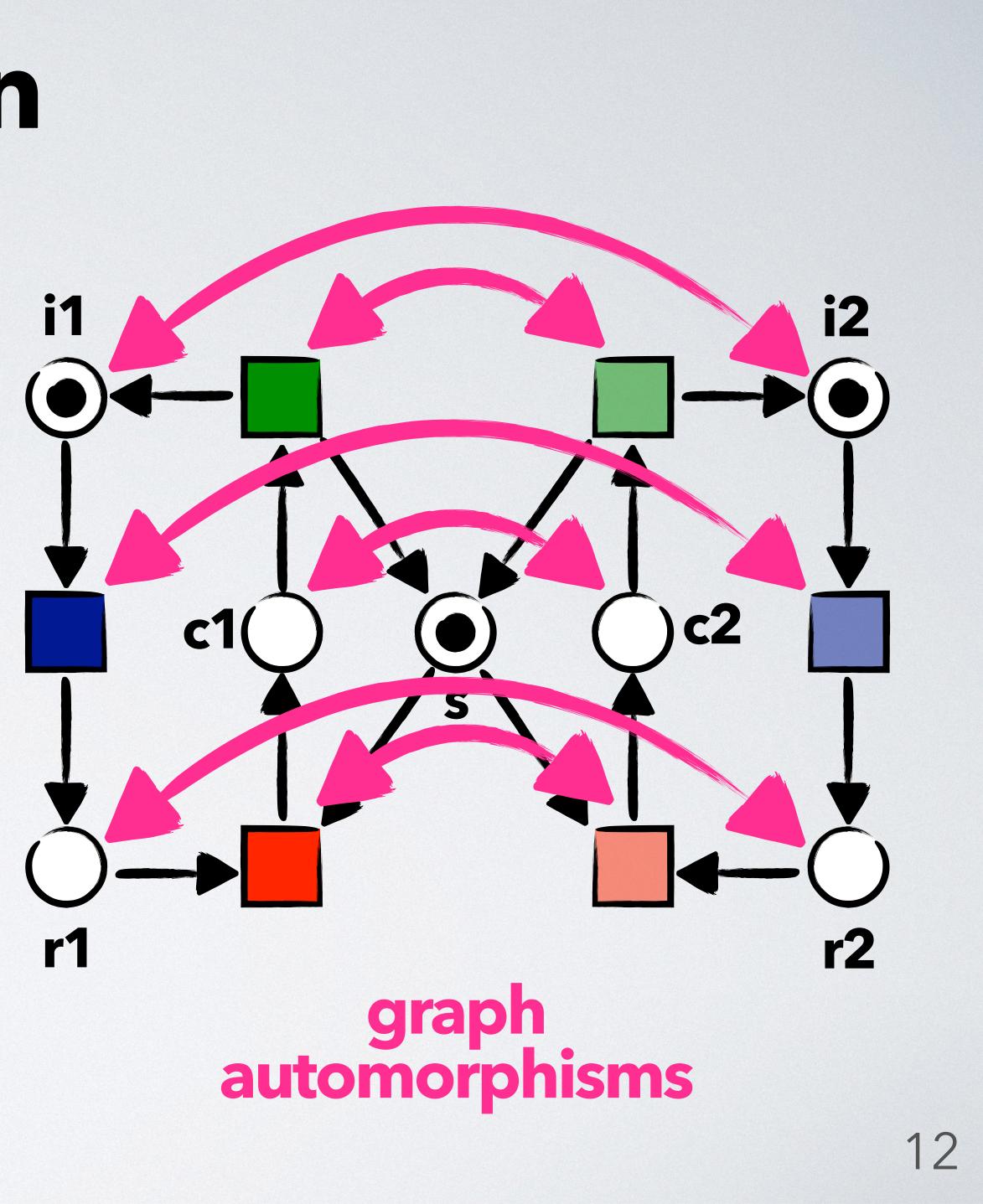


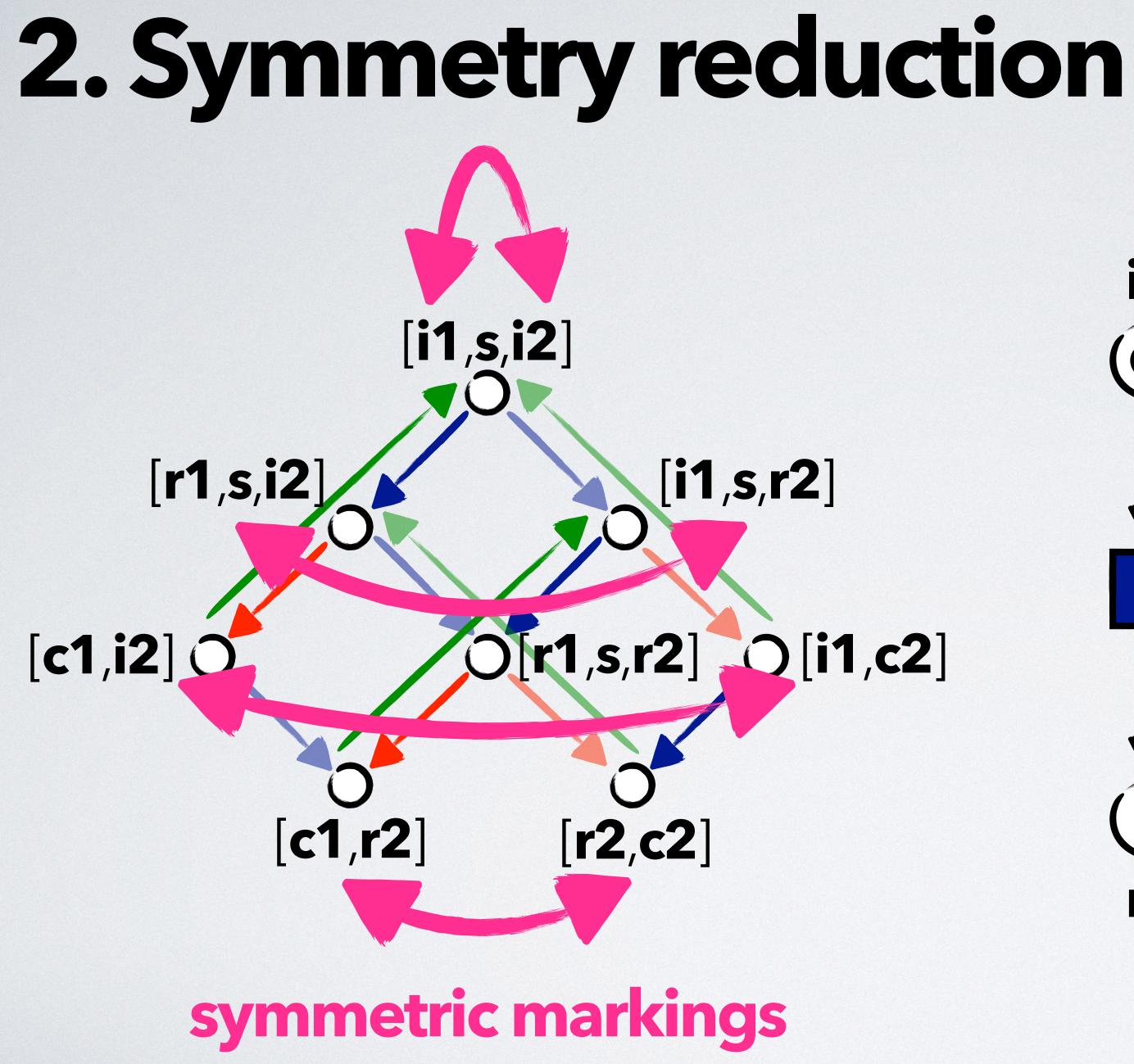
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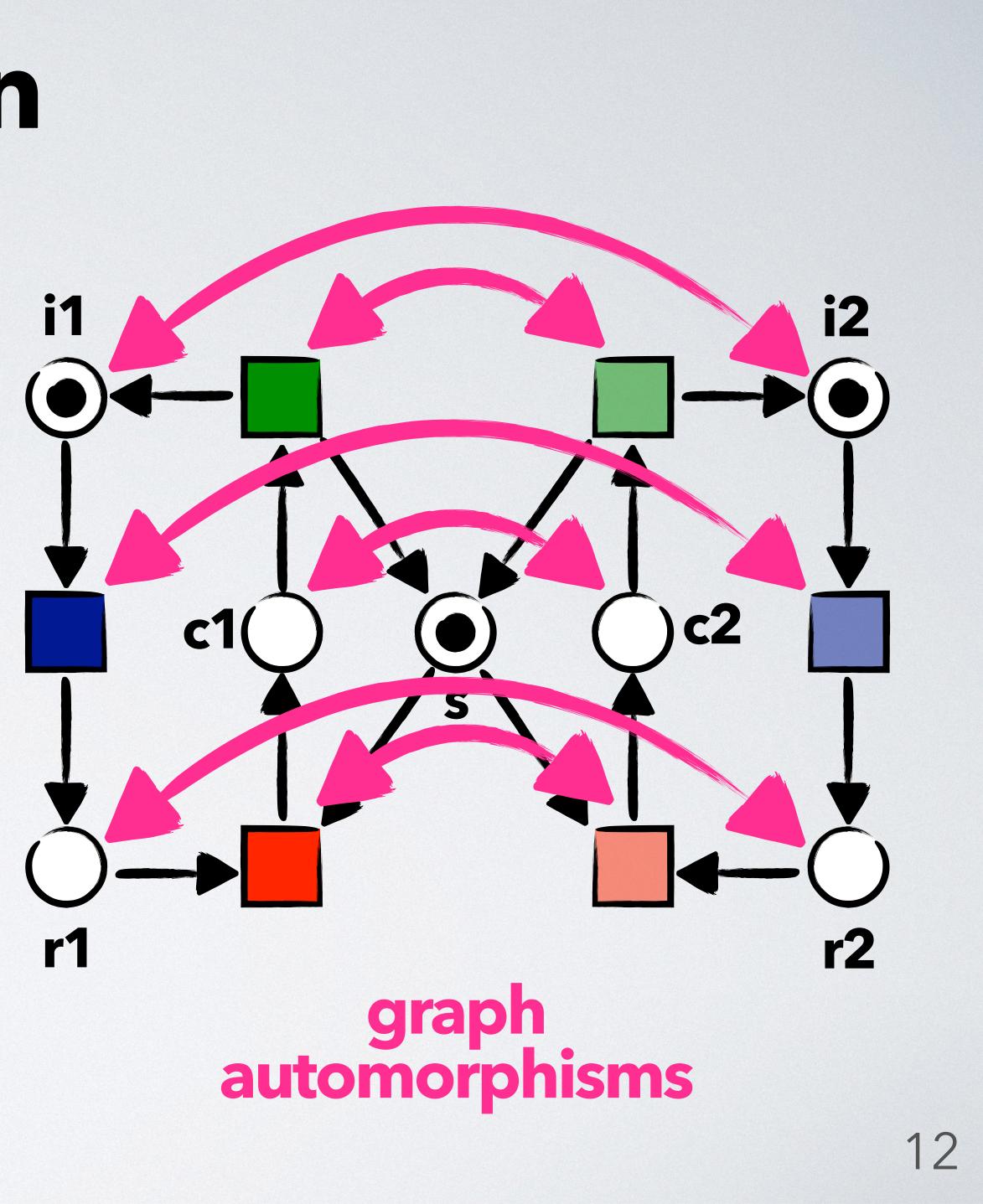


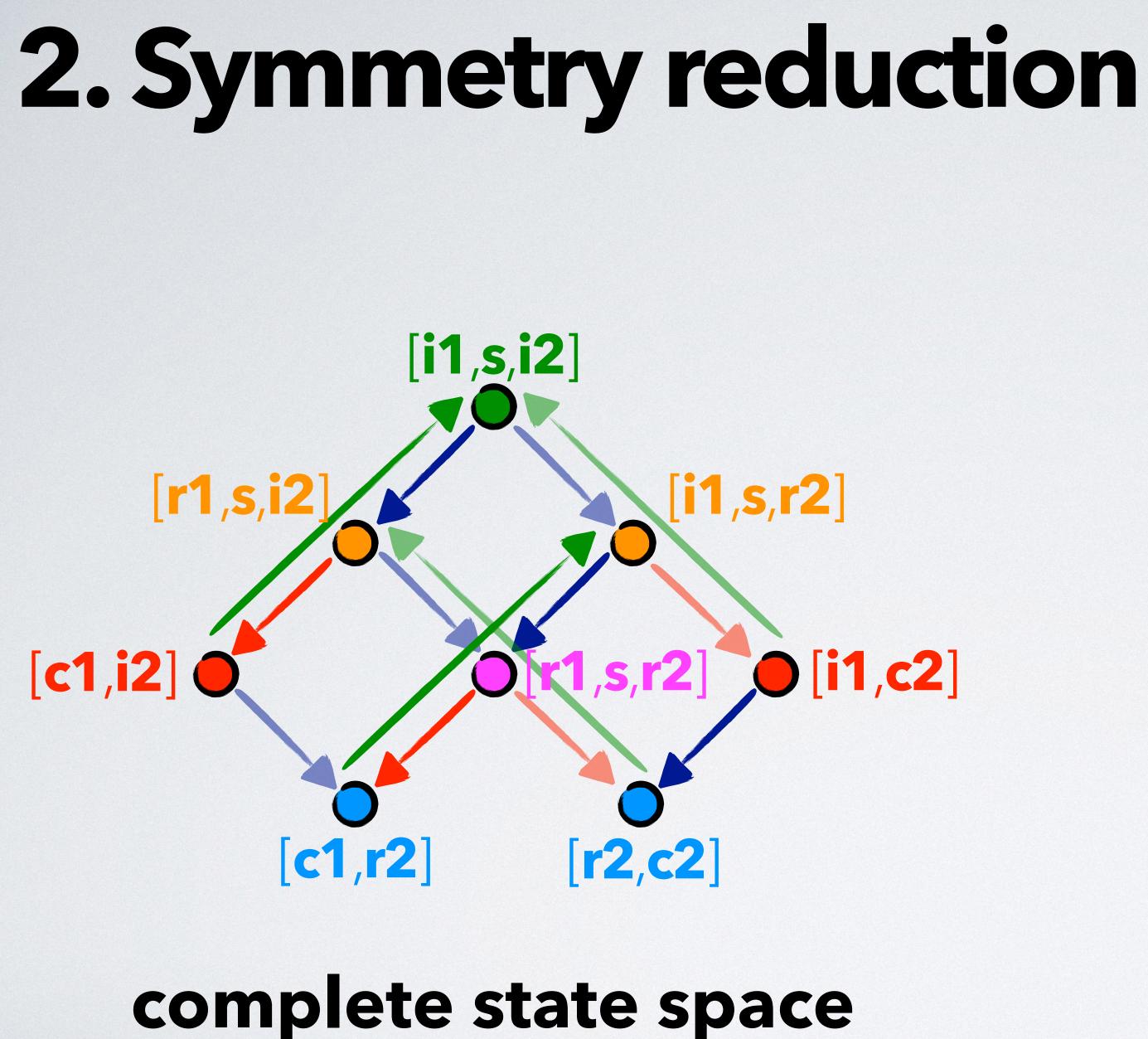


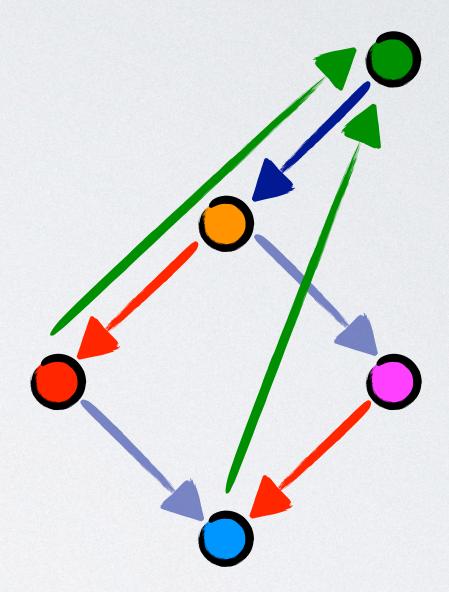
#### symmetric markings











### reduced state space



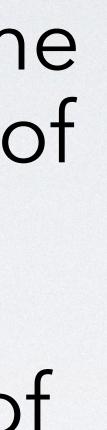
## 3. State compression

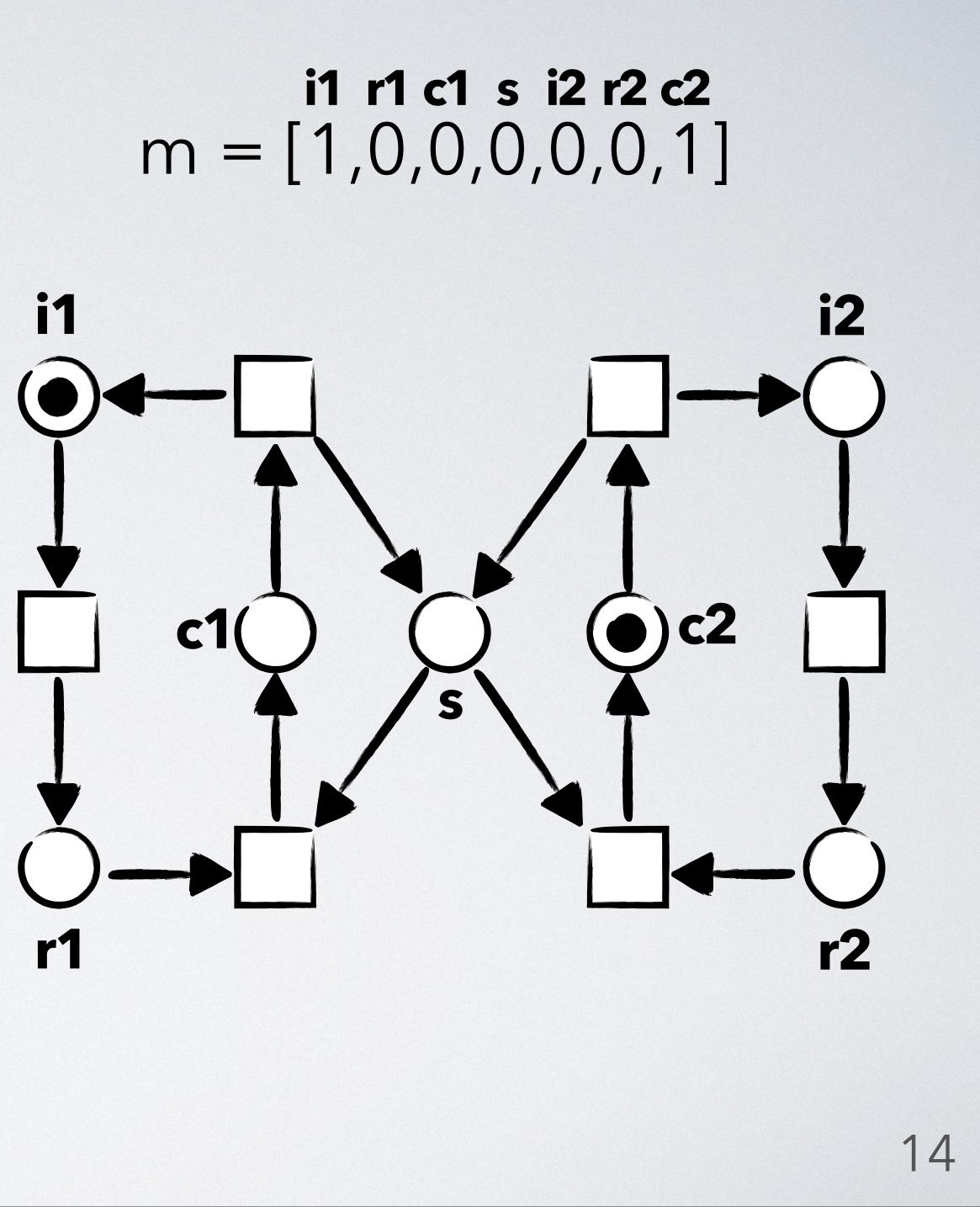
observation: the value of some places depend on the value of others

idea: do not store markings of "implicit places"

implementation: Petri net place invariants

# i1 r1 c1 s i2 r2 c2

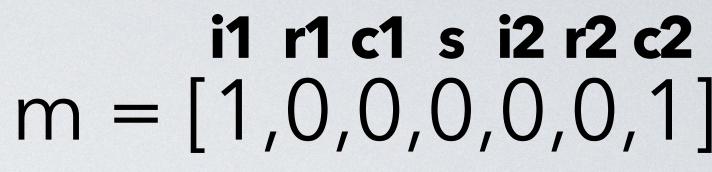


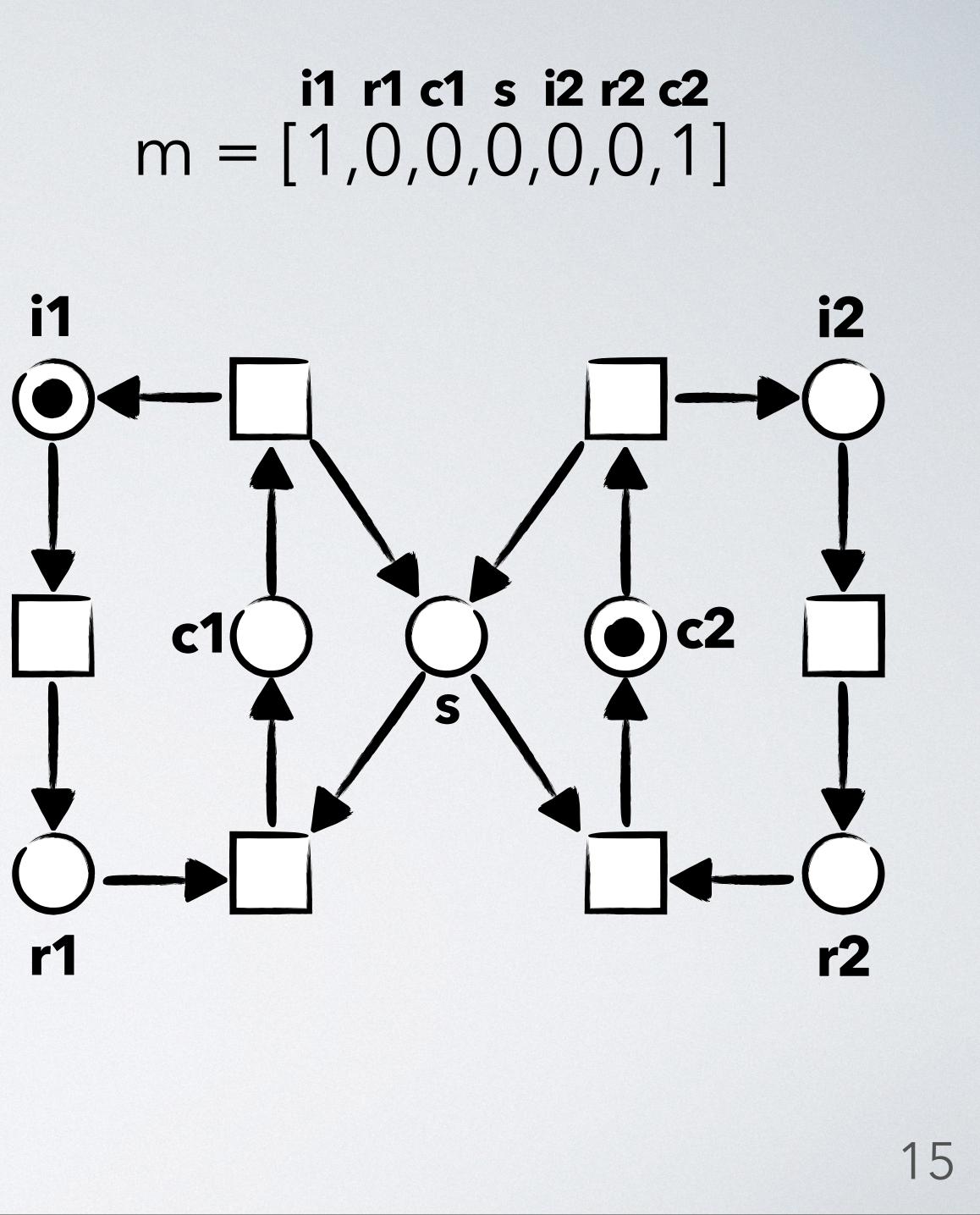


## 3. State compression

place invariants: for all reachable markings m:

m(c1) + m(c2) + m(s) = 1m(i1) + m(c1) + m(r1) = 1m(i2) + m(c2) + m(r2) = 1





### 3. State compression

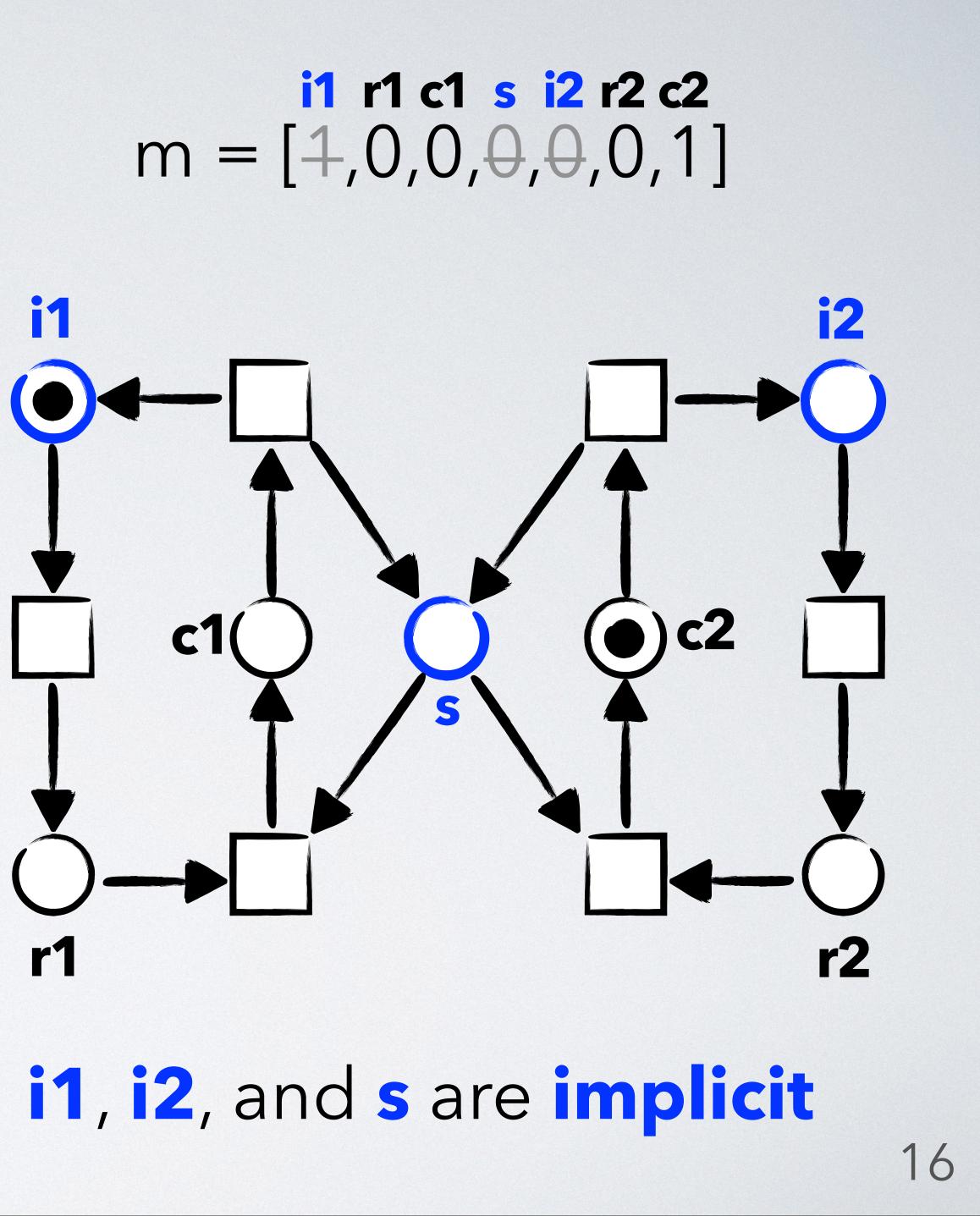
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therefore:

m(s) = 1 - m(c1) - m(c2)m(i1) = 1 - m(c1) - m(r1)m(i2) = 1 - m(c2) - m(r2)

# i1 r1 c1 s i2 r2 c2



## **Reduction techniques: implementation**

#### markings = [] c = compressor() s = symmetries() $search(m_0, \phi)$

2

3

def search( $m, \phi$ ):  $check(m, \phi)$ 1 markings.add(c.compress(m)) for t in selection(enabled(m)): m' = fire(m,t) if not s.symm(m') in markings: search(m',φ)

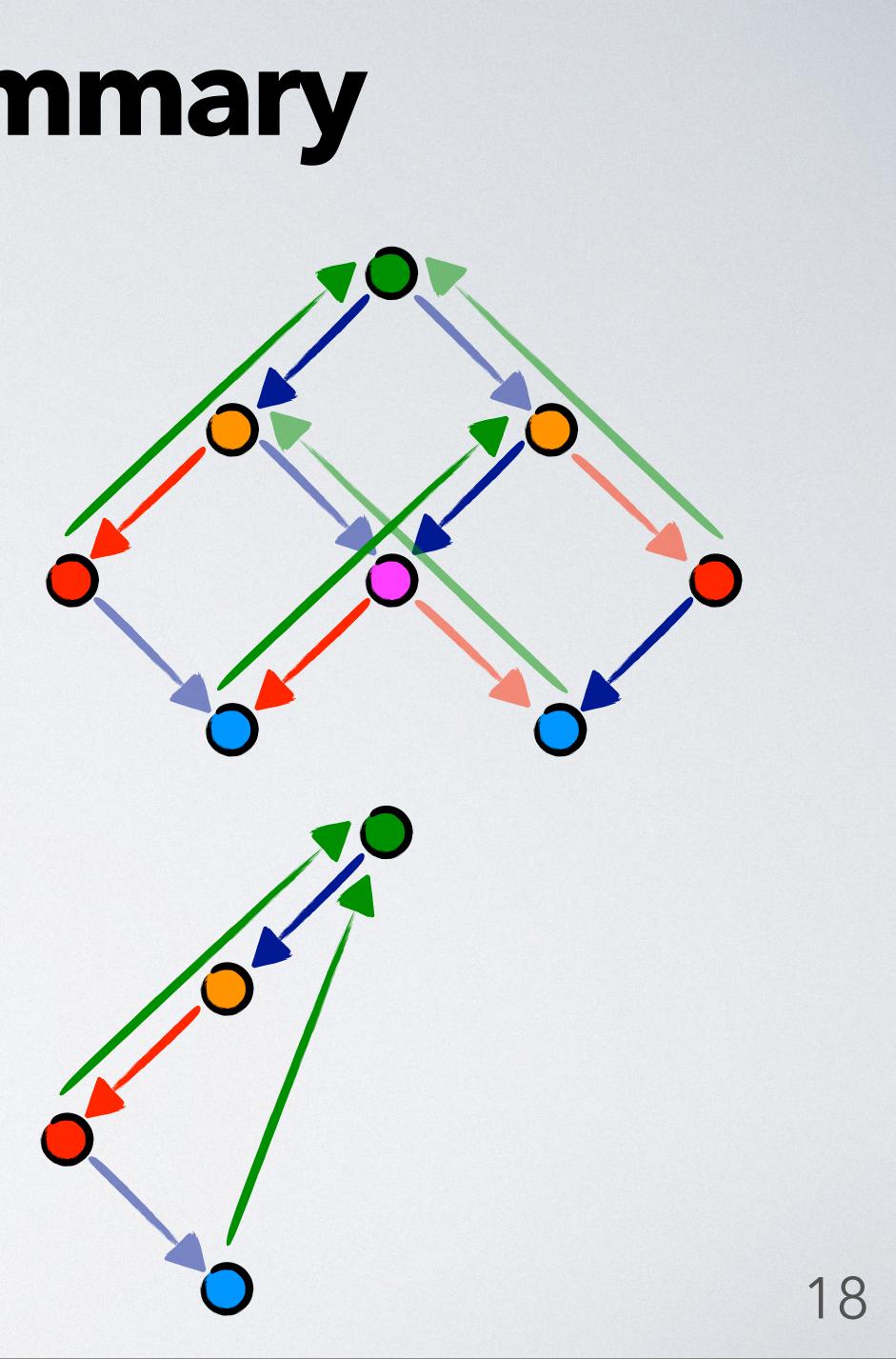
- compressor and symmetries preprocess the net
- compress creates shorter marking vectors
- selection chooses some enabled transitions

• symm checks if symmetric marking is already stored



### **Reduction techniques: summary**

- can be combined
- a lot of them work on the Petri net structure
- preprocessing pays off
- some are Petri net exclusive
- decades of research



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## Key: Pragmatism

#### good news

model checking is decidable

in the end: we only optimize a small depth-first search...
 ... that is run billions of times

we need to understand every aspect

pragmatism is key: we want a result at all costs

#### bad news

at a devastating complexity



# The programming language: C++

#### manual memory management

#### type system

# low-level optimization

#### preprocessor

# optional object orientation

#### portability

#### threading

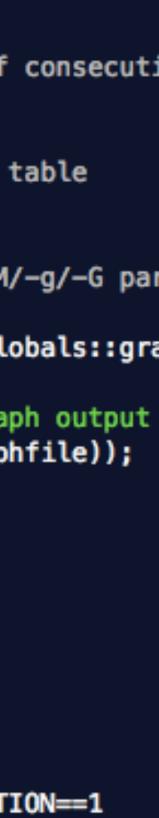




# Used anti-patterns

- heavy use of preprocessor (conditional compilation, compile-time decisions, architecture-dependent constants)
- god objects
- a lot of **global** variables
- no standard libraries/ generic algorithms (STL, Boost)
- remember: performance, not reusability

```
unsigned int depth_first() {
#ifdef DEPTH_FIRST
    ostream* graphstream = NULL;
    unsigned int i;
    State* NewState;
#ifdef CYCLE
    bool IsCyclic;
    unsigned int silentpath; // nr of consecut:
    Transition** fl;
#endif
    // init initial marking and hash table
    isbounded = 1;
#ifndef CYCLE
    // organize output file for -m/-M/-g/-G par
    if (Globals::gmflg) {
        graphstream = new ofstream(Globals::graphstream)
        if (graphstream->fail()) {
            abort(4, "cannot open graph output
            _cfilename_(Globals::graphfile));
    if (Globals::GMflg) {
        graphstream = &std::cout;
#else
    silentpath = 0;
#endif
#ifndef DISTRIBUTE
#if defined(SYMMETRY) && SYMMINTEGRATION==1
    Trace = new SearchTrace [Globals::Places[0]
#endif
    // initialize hash table
    for (i = 0; i < HASHSIZE; ++i) {</pre>
#ifdef BITHASH
        BitHashTable[i] = 0;
#else
        binHashTable[i] = NULL;
#endif
#endif
       WITHFORMULA
```



### Data structures frontend (parser)

syntactic sugar

class hierarchies

generated code/ standard libraries

focus on simplicity

#### backend (verification)

canonic representation

flat C-style arrays

simple and user-specified data types

focus on performance



### A remark on complexity

- While solving an EXPSPACE-complete problems, don't be afraid of complexity!
- Preprocessing and optimizations can have dramatic impact.
- NP-complete (SAT-solving) or NP-hard (integer linear programming) problems can be "feasible".





# Formalism modeling formalisms



- varying feature set
- domain dependent
- moving target, short lifespan



#### verification formalism

### 

#### **low-level Petri nets**

no structural restrictions
domain independent
sound, mature theory



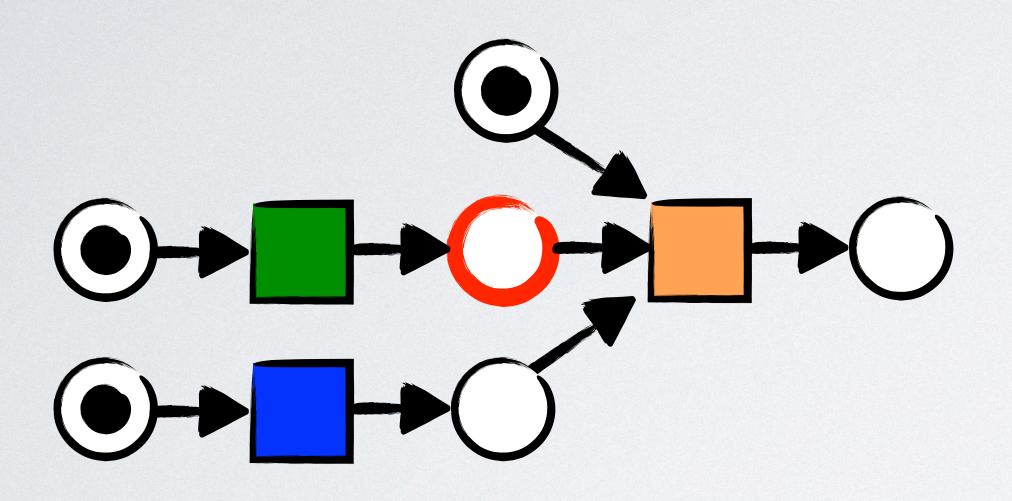
# Petri net model checking

- exploit domain knowledge to optimize core functions
  - firing transitions
  - storing markings
- know lifecycle of concepts
- often contradicts object orientation



### Checking enabledness

#### orange transition is disabled

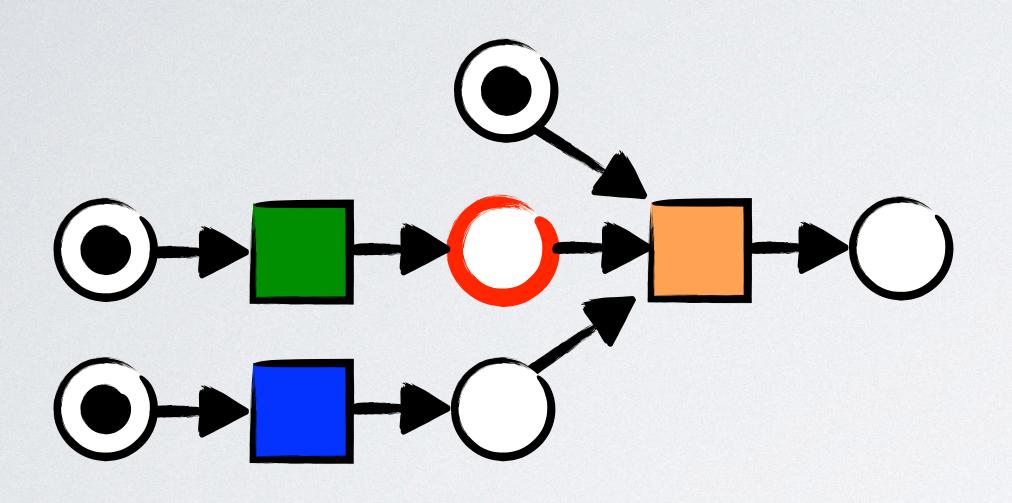






### Checking enabledness

#### orange transition is disabled



#### scapegoat place

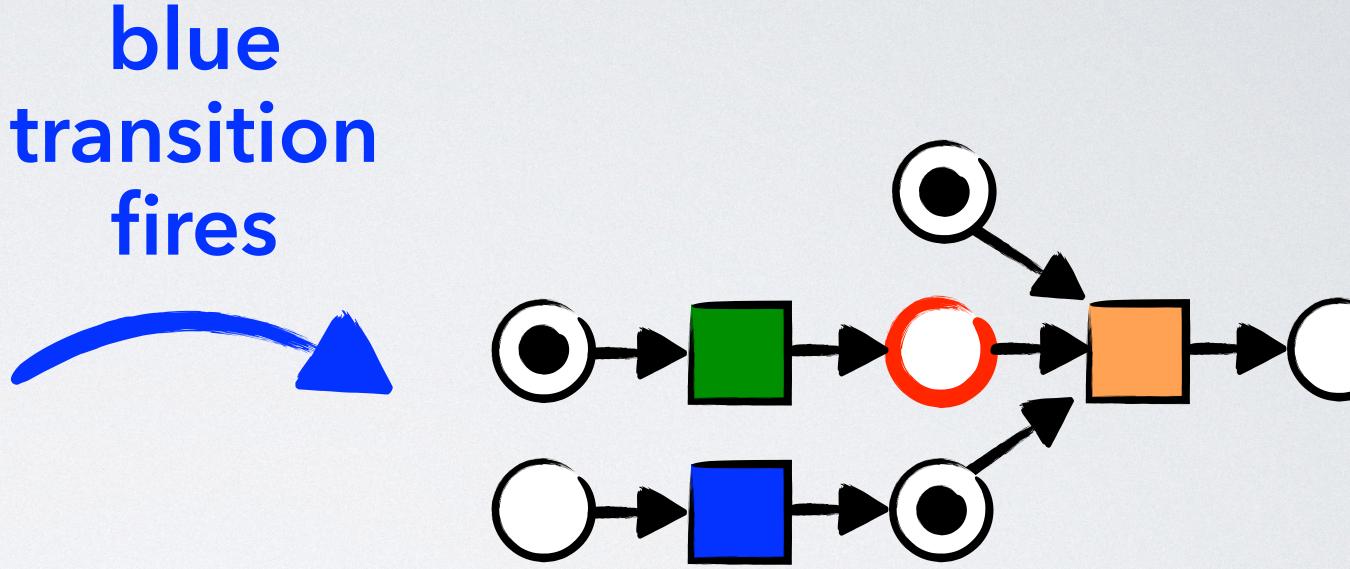




# Checking enabledness orange transition is disabled

#### scapegoat lace D



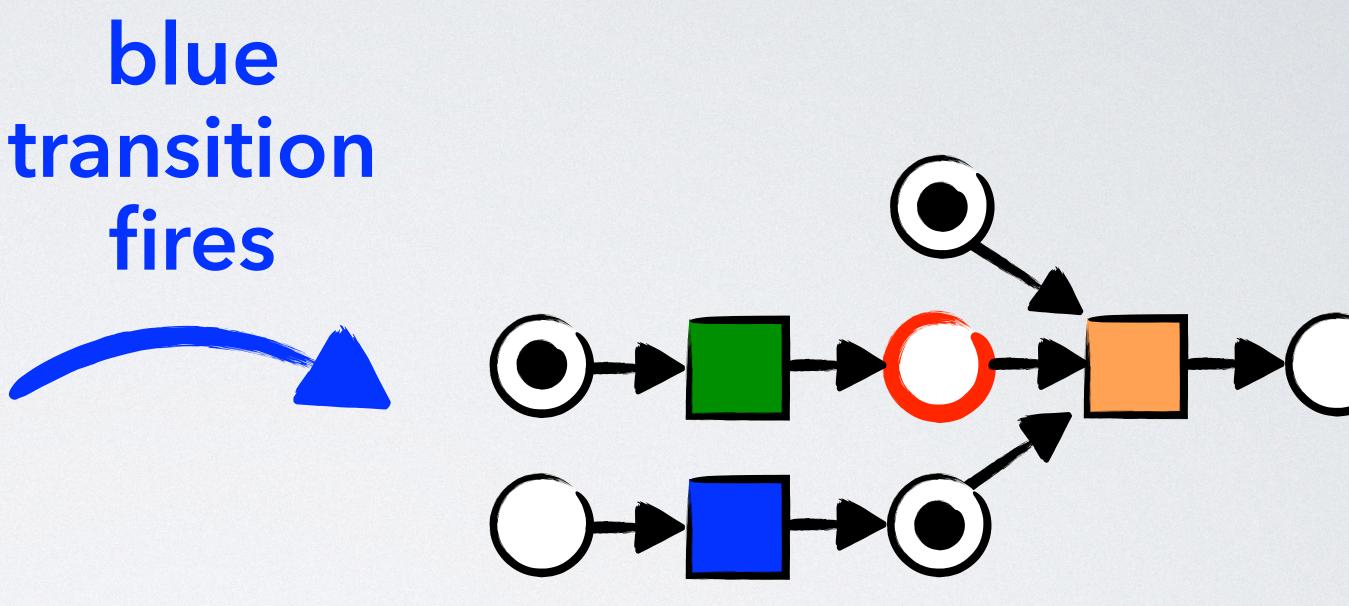




# Checking enabledness orange transition is disabled

#### scapegoat place





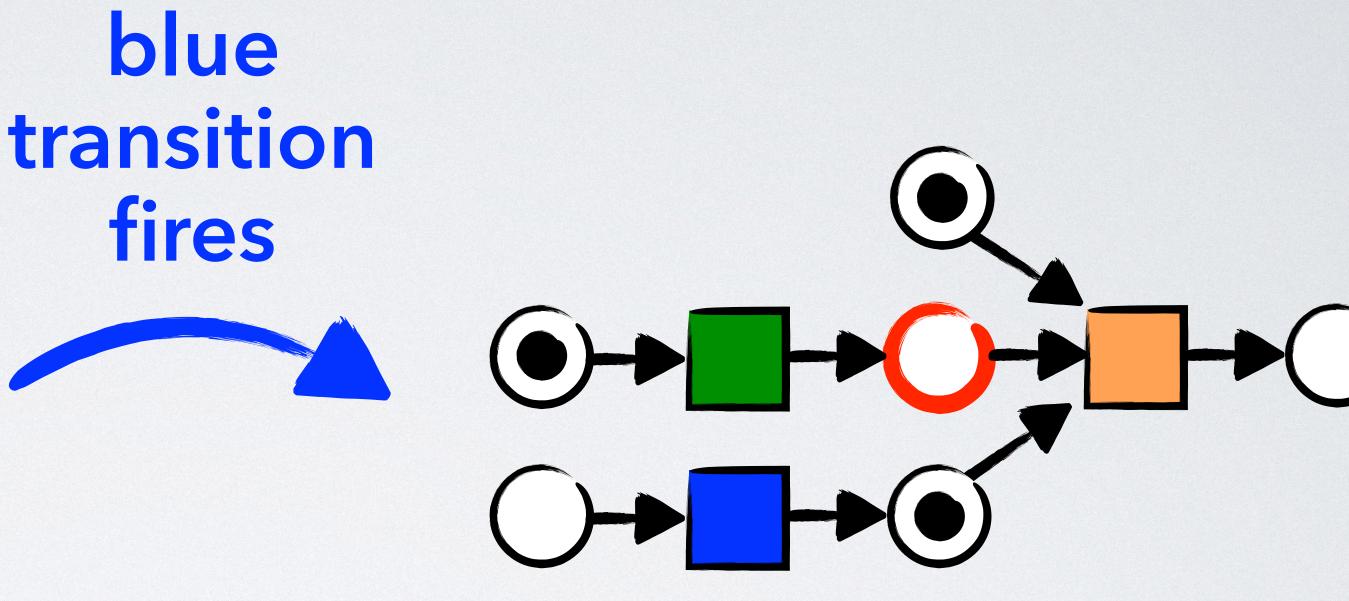
#### scapegoat place still unmarked



# Checking enabledness orange transition is disabled

#### scapegoat place





# scapegoat place → orange transition still unmarked → is still disabled



markings

bit vectors

[0, 1, 3, 3, 1]0001111101 [0, 1, 3, 2, 0]00011110000 [0, 1, 3, 2, 1]0001111001

### bin tree

### 0001111101 00011110000 0001111001



markings

bit vectors

[0, 1, 3, 3, 1]0001111101 [0, 1, 3, 2, 0]00011110000 [0, 1, 3, 2, 1]0001111001

#### bin tree

### 0001111101 00011110000 0001111001



markings

bin tree 01 00011110000 0001111001

bit vectors [0, 1, 3, 3, 1]0001111101 [0, 1, 3, 2, 0]00011110000 [0, 1, 3, 2, 1]0001111001



markings

bin tree 101 00011110000 0001111001

bit vectors 0001111101 [0, 1, 3, 3, 1][0, 1, 3, 2, 0]00011110000 [0, 1, 3, 2, 1]0001111001



markings

bin tree 01 0001111000

bit vectors [0, 1, 3, 3, 1]0001111101 [0, 1, 3, 2, 0]0001111000 [0, 1, 3, 2, 1]0001111001



## Know what you need

- sometimes, only a special case is needed:
  - Tarjan algorithm where only TSCCs are needed
  - linear algebra (sparse matrix, only carrier is needed)
- no library can offer this





### Optimizations

- profiling, low-level optimizations (caching)
- know your limits: (in LoLA: malloc)

### ations (caching) malloc)



# Academic software design

hardly any tenure programmers seldom seen as important

coding is never top priority your thesis is!

maintenance is not enforced

hard to collect/ keep knowledge people leave frequently and for good

#### there is no (paying) customer no agreed feature set

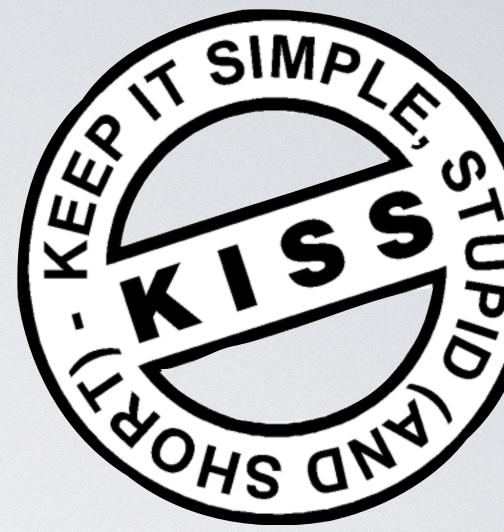
- definitely no coding professionals
- university cannot teach experience
  - very fast scientific progress moving targets
- once the paper is out, nobody cares

frequently changing staff **2-5 year contracts** 



### Lessons learned

- prototyping and check on real data
- KISS; few dependencies
- split large tools to smaller "brain-sized" units
- test coverage to avoid the fear of breaking everything
- goal orientation: no UI, integration via streams



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# How to use a model checker pragmatically?



## Verification questions: the don'ts

Don't ask for global states. Usually, only a **few aspects** (marking of a few places) are relevant.

Don't ask two things at once.

Don't use the X operator.

Don't order unordered things. If the properties affect different parts of the model, ask **separately**.

In **distributed systems**, it makes no sense to ask for "the" next state.

Usually, **all components** should be correct, not just component #1.



# Verification questions: the dos

#### Ask simple questions.

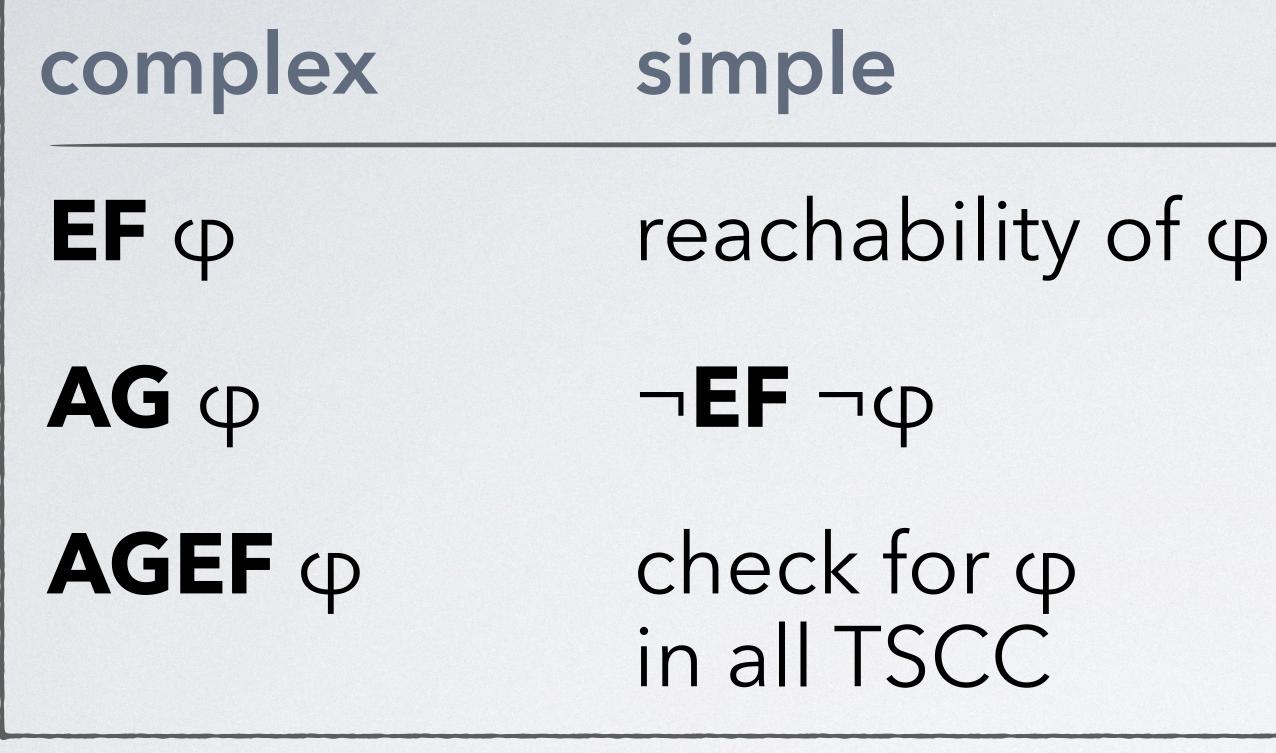
Make a verification model.

**Use domain** knowledge.

- Sometimes, you don't need temporal logics at all.
- Manipulating the original model may help to ask simpler questions.
- Exploit implicit assumptions about the model and the property.



# Simple properties



lesson: (hardly) no need for complex CTL\* formulae compilers will help to find best match

#### reason

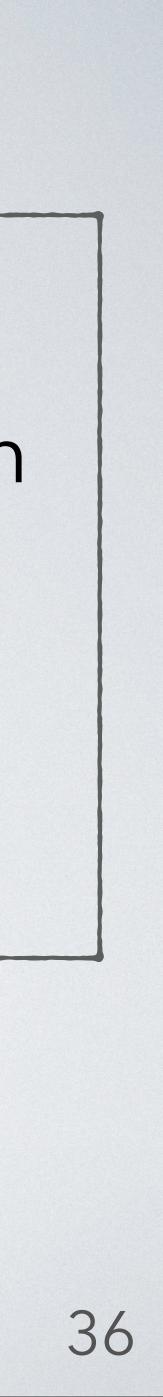
trivial check function

again reachability

reachability + TSCC detection

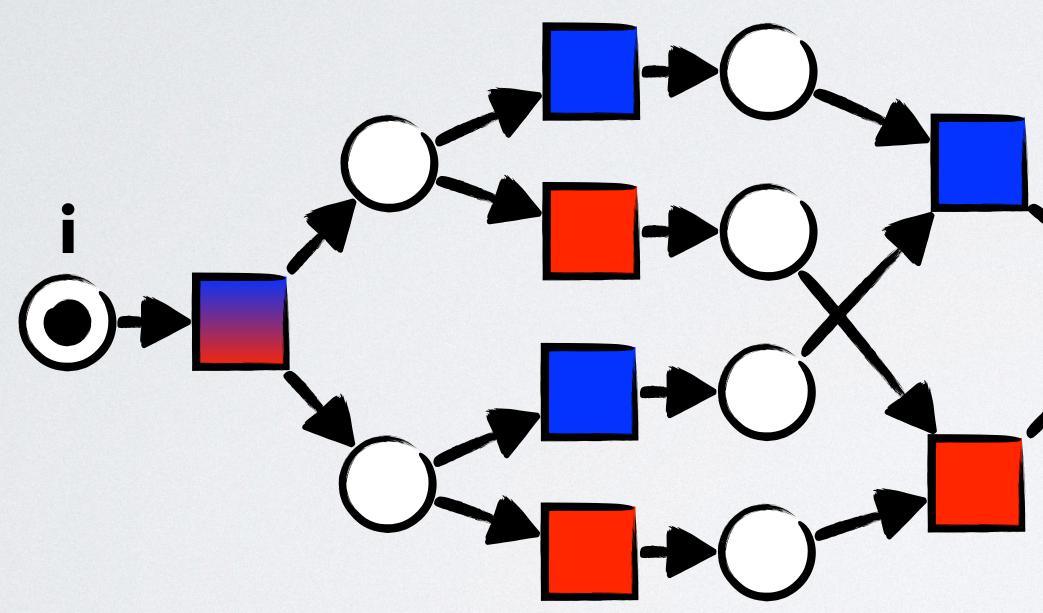
SCC

TSCC



# Checking relaxed soundness

**Definition**: A workflow net is *relaxed sound* iff for all transitions exists a terminating firing sequence.



net is relaxed sound

if choices are not synchronized, the net deadlocks

but every transition can fire in a terminating sequence



# Net manipulation: algorithm

1. for all transitions t: create a net with test place pt:

#### 2. check for **EF** ( $p_t > 0 \land o = 1$ )

- Pt
- $\bigcirc$



# Net manipulation: summary

- check 8 nets instead of 1
- + checking reachability is simpler than extended CTL
- + each state space is smaller than the original
- + one counterexample for each failure
- + parallelizable



# Checking soundness

marking [o] is always reachable (2) [o] is the only marking with tokens on place o, and (3) no transition is dead.

#### + domain knowledge: nets are free-choice

(1) AGEF [o] holds,(2) the net is 1-safe, and (3) no transition is dead.

# **Definition**: A workflow net is **sound** iff (1) the final

#### **Definition**: A free-choice workflow net is **sound** iff



# Checking soundness

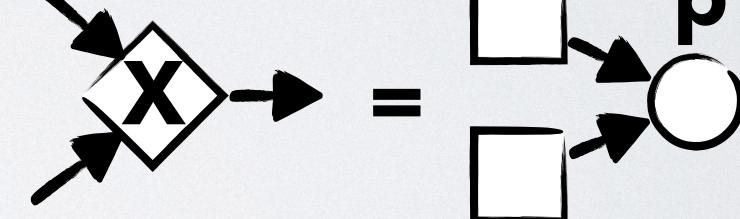
(1) check if the marking [o] is reachable in all TSCCs.

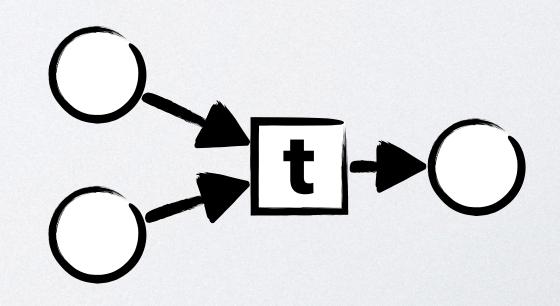
(2) for every join-place p, check if m with m(p)>1 is reachable.

(3) for every transition t, check if 't is reachable



#### **Definition**: A free-choice workflow net is *sound* iff (1) AGEF [o] holds, (2) the net is 1-safe, and (3) no transition is dead.







### Pragmatic use: summary

- help the model checker help you
- reformulate your question
- many small state spaces are better than one large





#### How does a model checker work?

# How to build an effective model checker?

# How to use a model checker pragmatically?

# Conclusions



## Take home points

- model checking = theory + practice + pragmatism
- academic software design is a discipline on its own
- asking the right question(s) is crucial



# Pragmatic model checking: from theory to implementations

Niels Lohmann

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Fraditio et Innovatio



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