

Kleene Algebras and Applications

Alexandra Silva

Course Content

Lecture 1

Kleene algebra
Brzozowski derivatives
Antimirov derivatives
Equivalence via automata

Lecture 2

Coinduction up-to

Lecture 3

Equivalence via axioms
Completeness

Lecture 4

Extensions with tests,
observations, and
concurrency

Lecture 1

Context

while *a & b* **do**

p;

od;

while *a* **do**

q ;

while *a & b* **do**

p;

od

od

?

≡

while *a* **do**

if *b* **then**

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else

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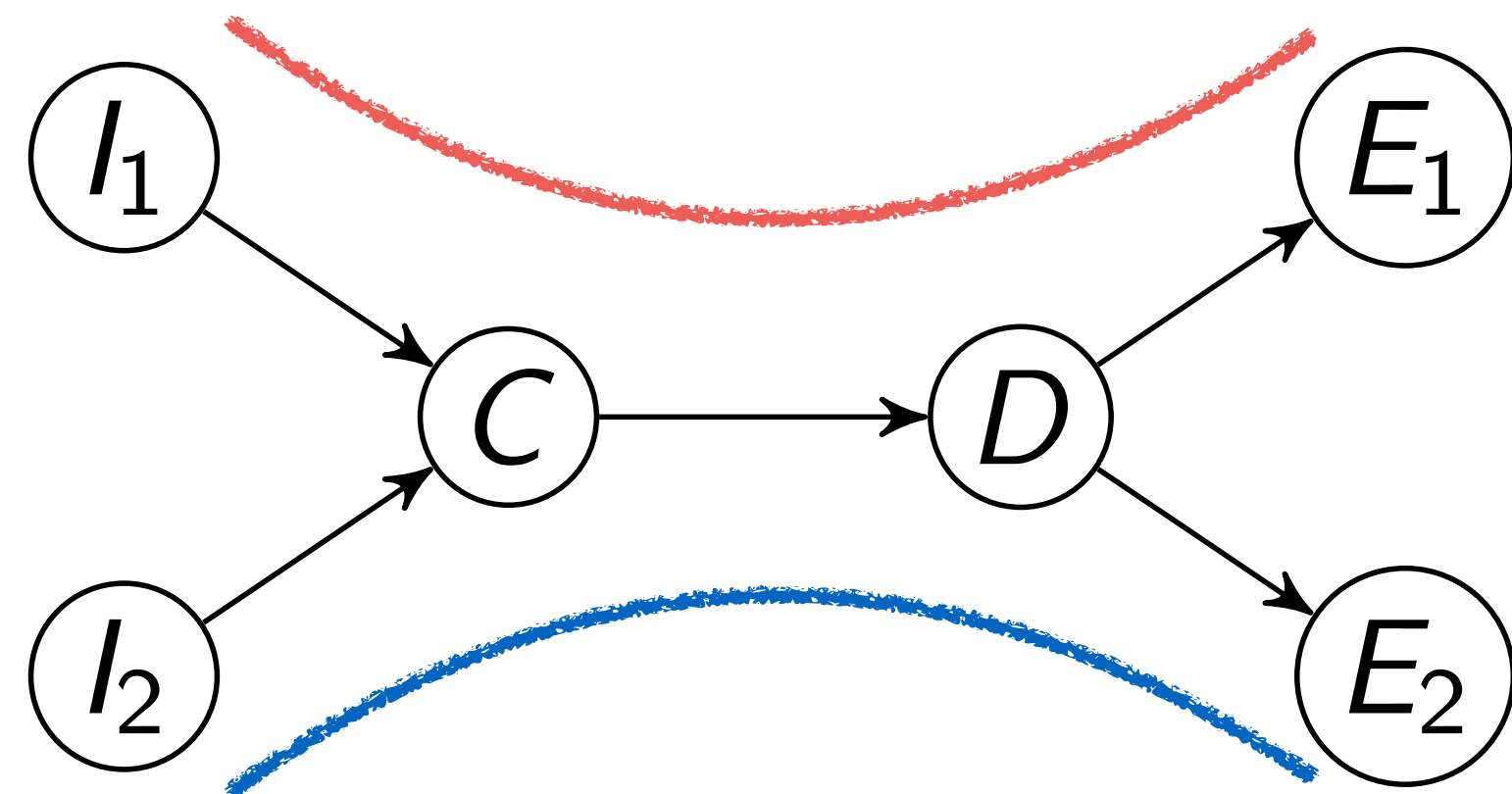
p;

else

q;

od

$I_1 ; p ; E_1 \equiv 0$



Context

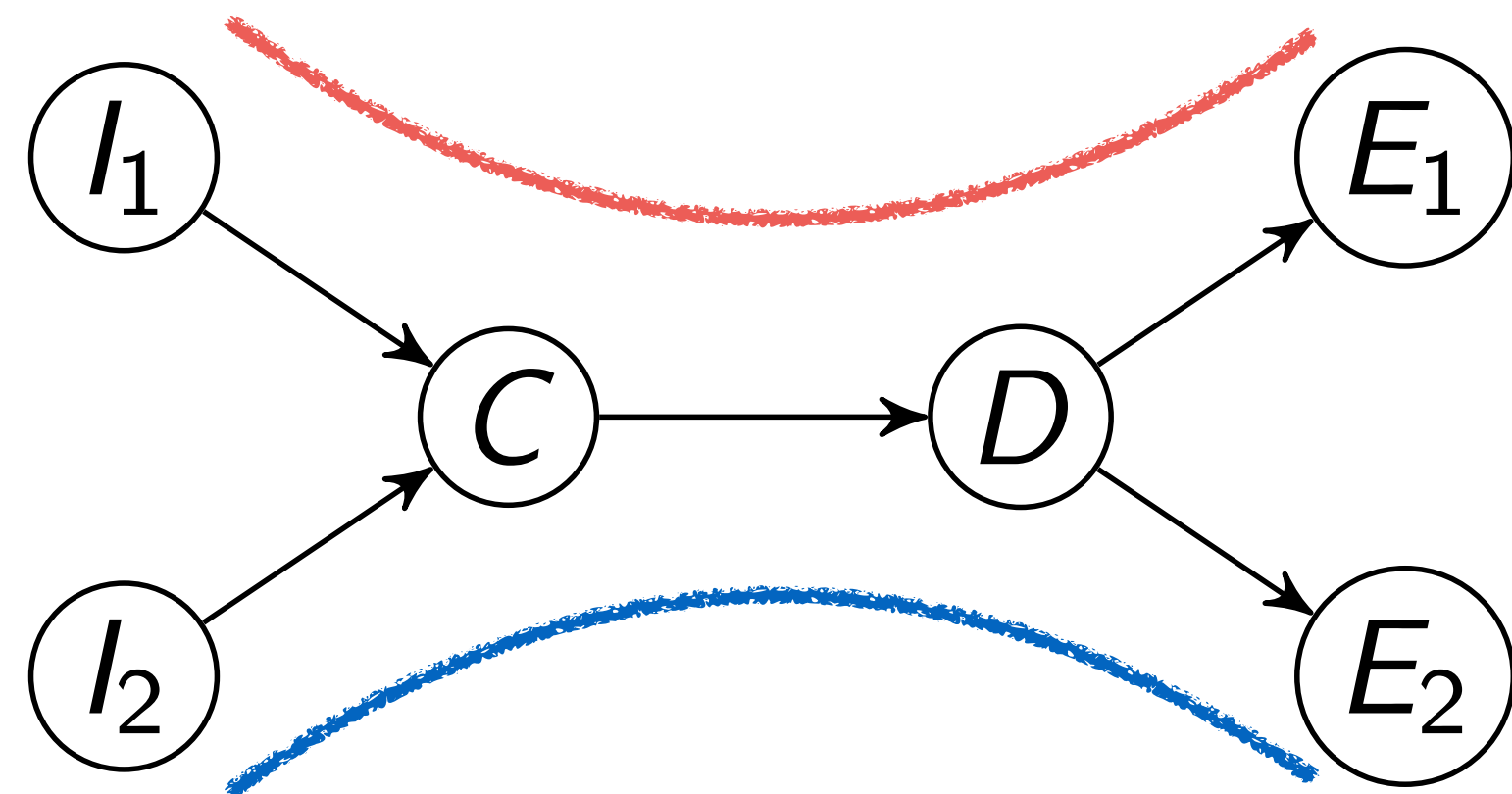
```
while a & b do  
  p;  
od;  
while a do  
  q;  
  while a & b do  
    p;  
  od  
od
```

≡
?

```
while a do  
  if b then  
    p;  
  else  
    q;  
  od
```

Verification via
Program Equivalence

$$I_1 ; p ; E_1 \equiv 0$$



Languages of traces

Some notation

A - finite alphabet

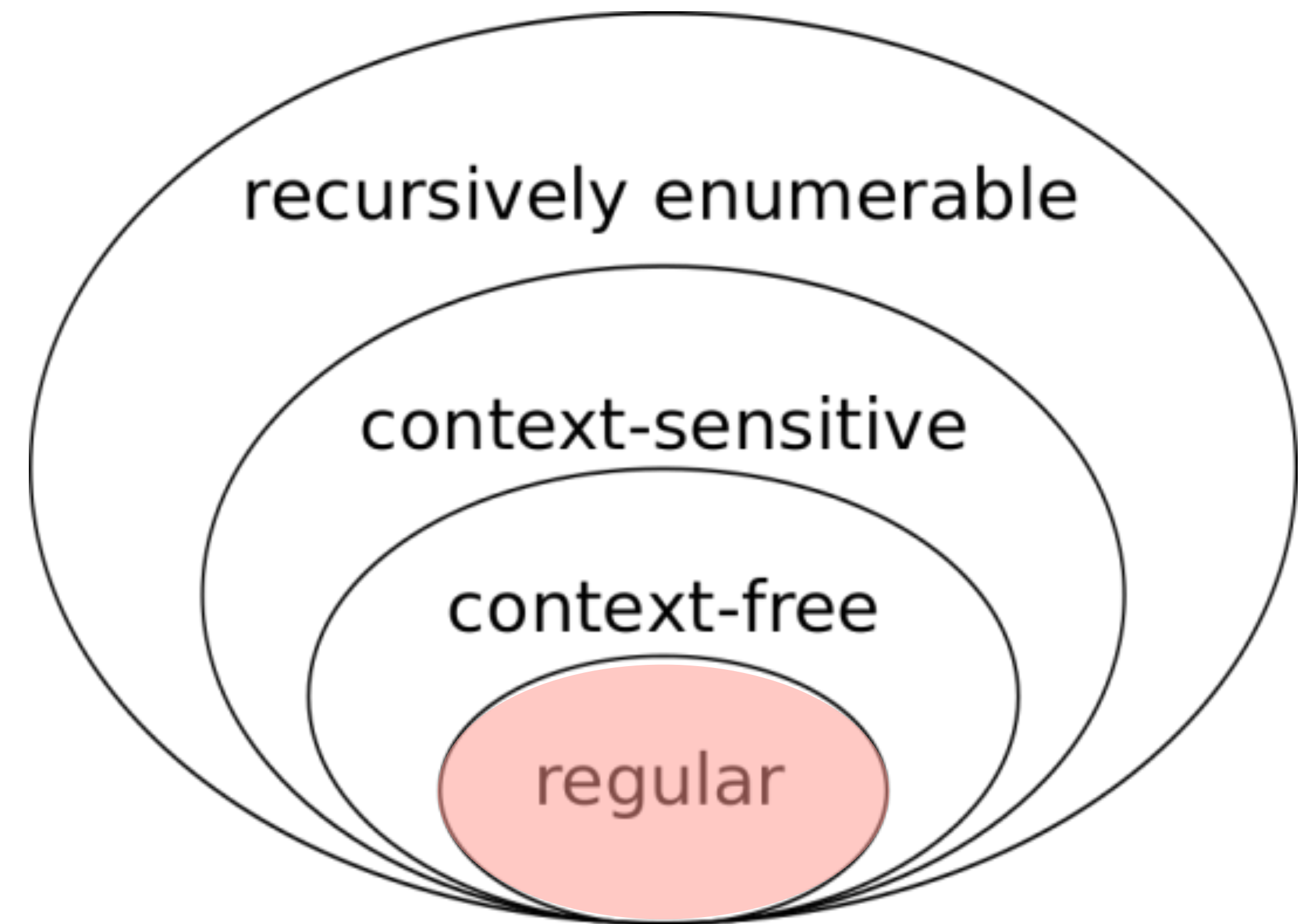
A* - finite words over A

Empty word - ε

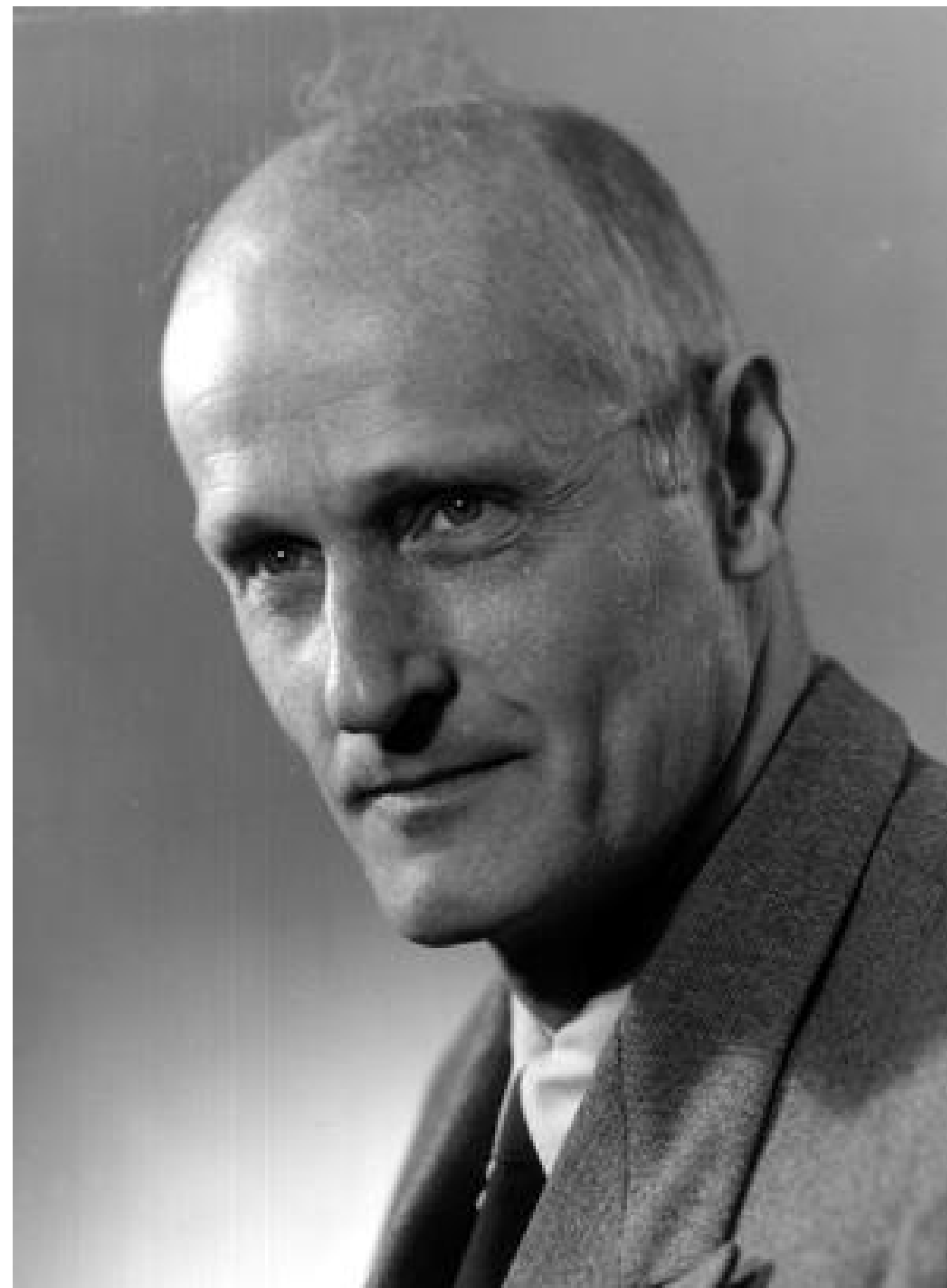
Language - subset of words

$L \subseteq A^*$

Chomsky hierarchy

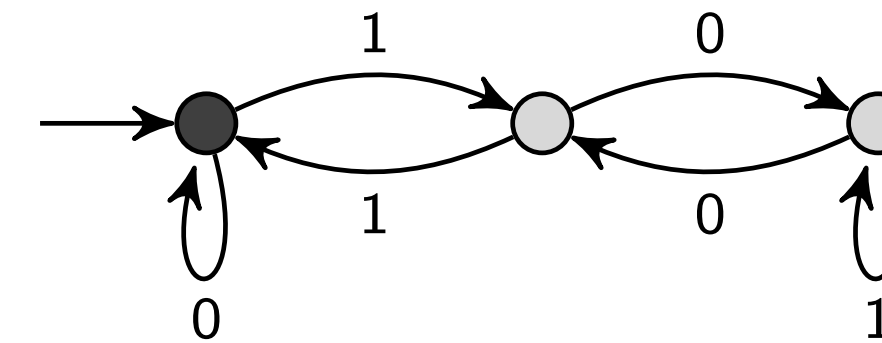


Kleene Algebra

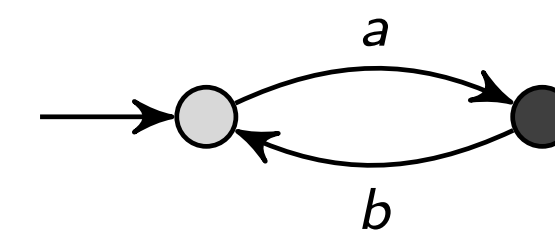


Stephen Cole Kleene
(1909–1994)

$(0 + 1(01^*0)^*1)^*$
 {multiples of 3 in binary}



$(ab)^*a = a(ba)^*$
 { $a, aba, ababa, \dots$ }



$(a + b)^* = a^*(ba^*)^*$

{all strings over $\{a, b\}$ }



Regular expressions

$$r, r_1, r_2 ::= \underline{1} \mid \underline{0} \mid a \in A \mid r_1 + r_2 \mid r_1 r_2 \mid r^*$$

Regular expressions

$$r, r_1, r_2 ::= \underline{1} \mid \underline{0} \mid a \in A \mid r_1 + r_2 \mid r_1 r_2 \mid r^*$$

Language Semantics

$$L(\underline{1}) = \{\epsilon\}$$

$$L(\underline{0}) = \emptyset$$

$$L(a) = \{a\}$$

$$L(r_1 + r_2) = L(r_1) \cup L(r_2) \quad L(r_1 r_2) = L(r_1) \cdot L(r_2) \quad L(r^*) = L(r)^*$$

Exercise

What languages do these expressions describe?

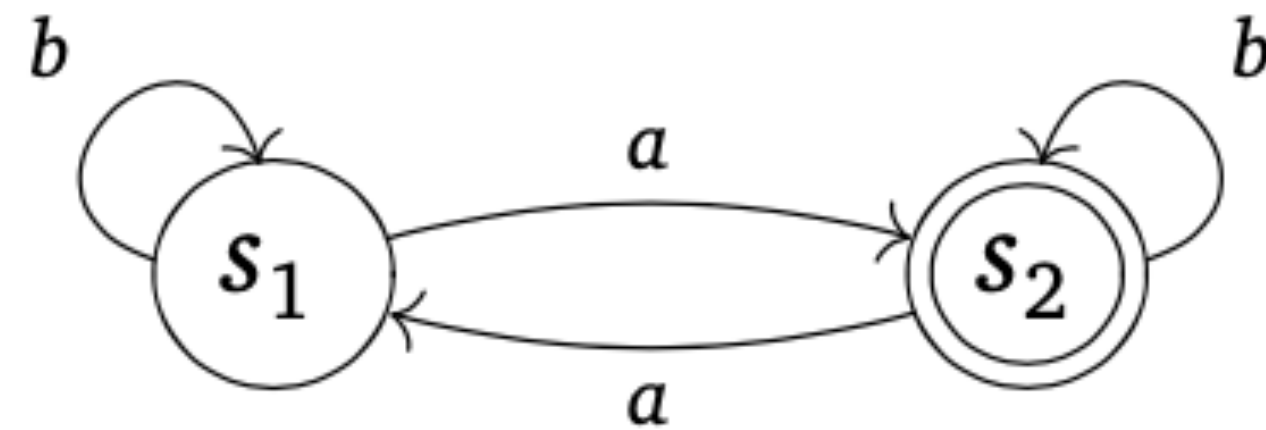
$$(a + b)(a + b)(a + b)^*$$

$$a^*ba + b^*ab$$

Give a regular expression describing this language?

$$L = \{w \in A^* \mid w \text{ contains } aba \text{ at least once}\}$$

Deterministic Finite Automata



$(S, \langle o, t \rangle)$
↑
States (set)

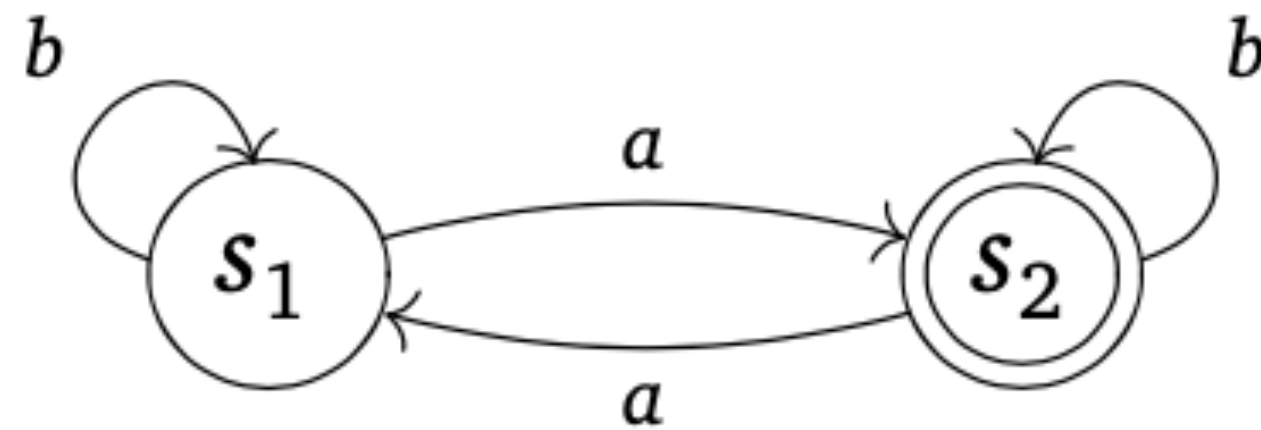
$o: S \rightarrow 2$

Final states

$t: S \rightarrow S^A$

Transition Function

Deterministic Finite Automata



$(S, \langle o, t \rangle)$
↑
States (set)

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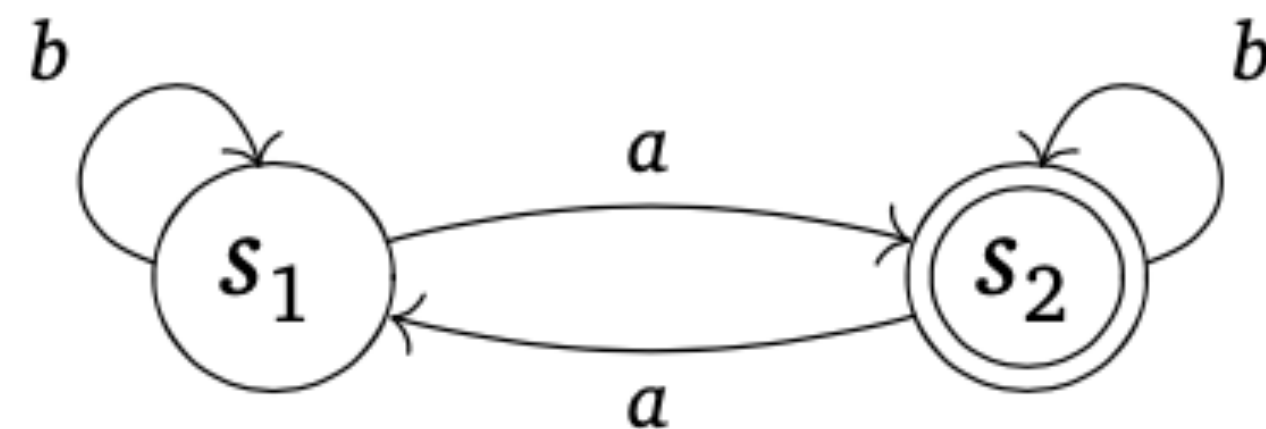
Transition Function

Inductive extension

$$t^*(s)(\varepsilon) = s$$

$$t^*(s)(aw) = t^*(t(s)(a))(w)$$

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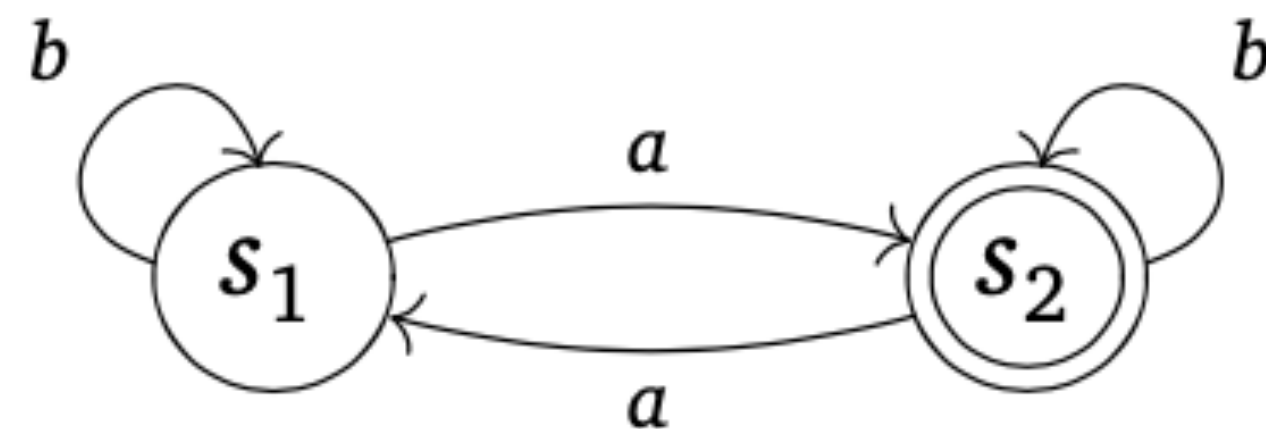
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Notation

$$s_w = t^*(s)(w)$$

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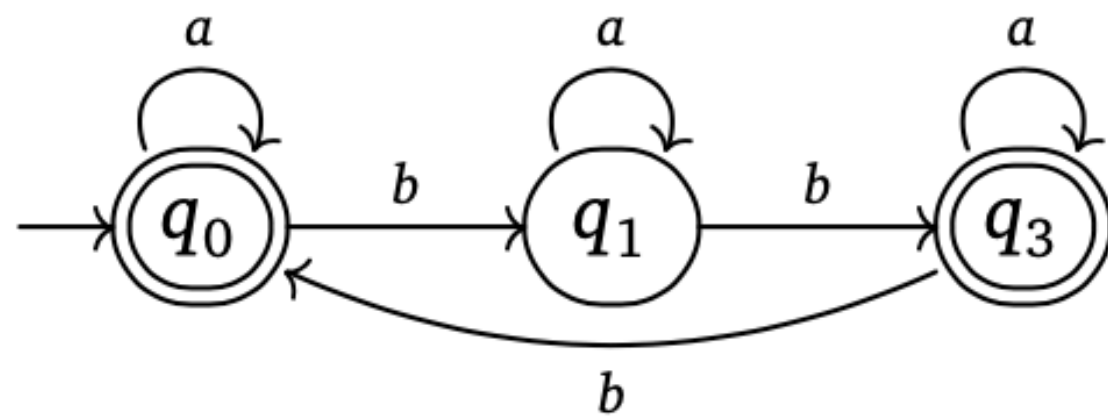
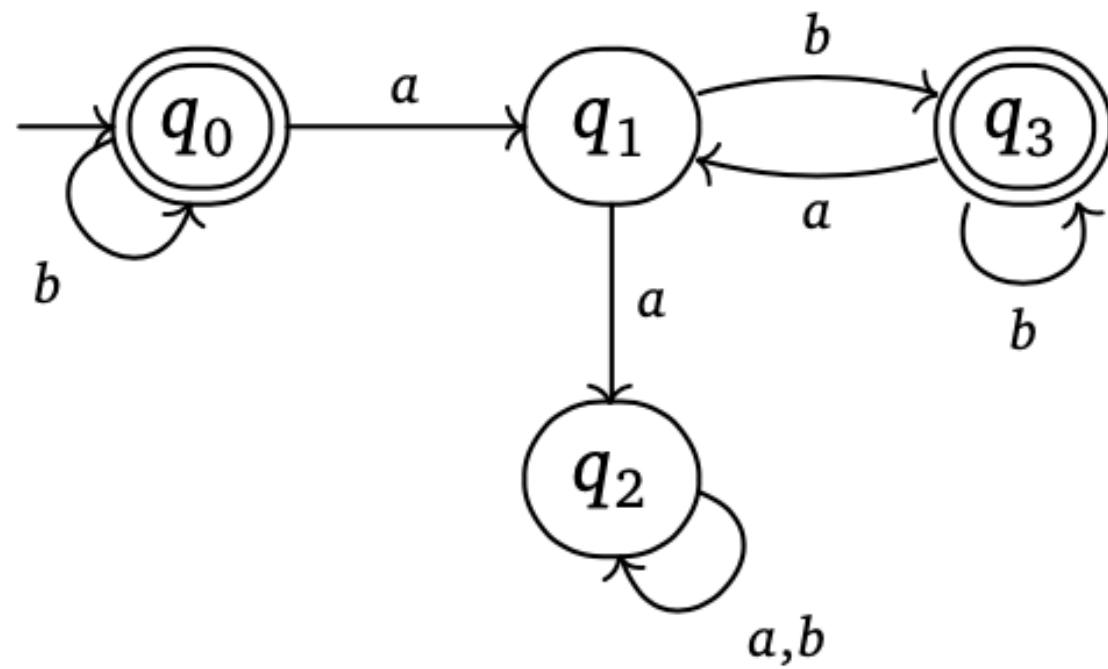
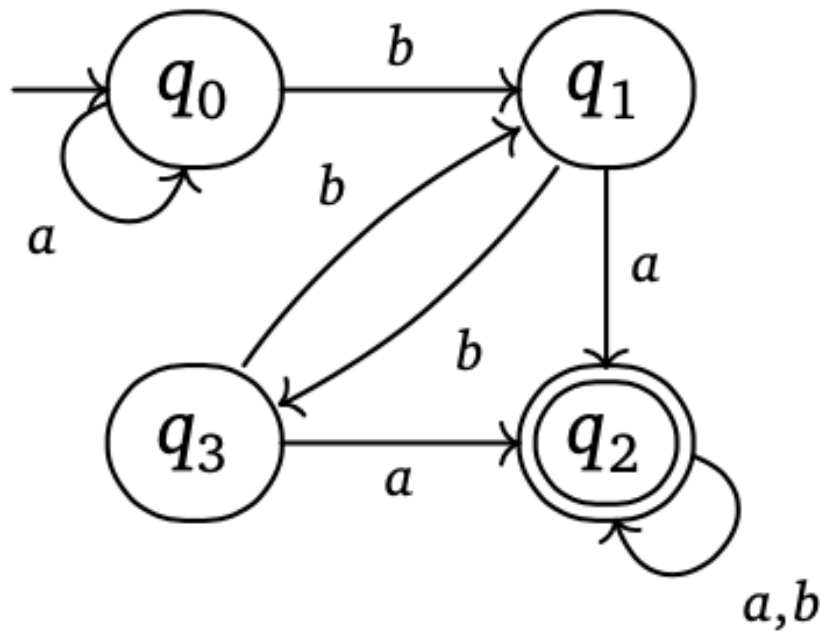
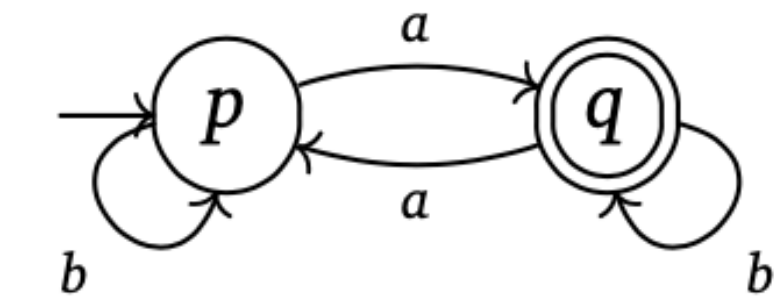
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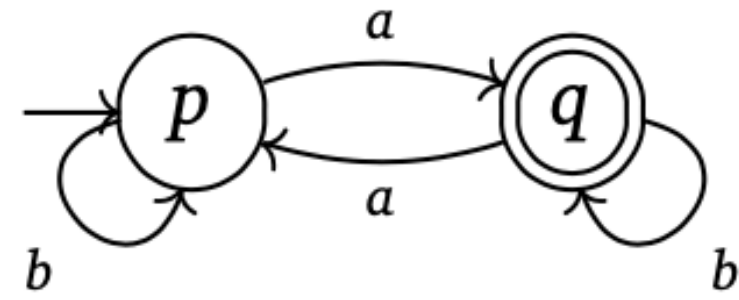
Language accepted by a state

$$w \in L(s) \iff o(s_w) = 1$$

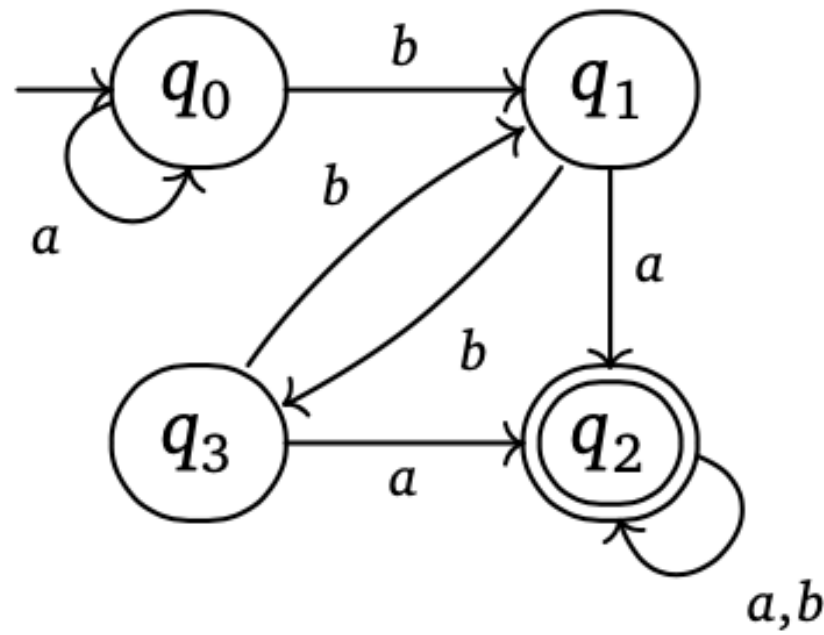
Exercise - DFA



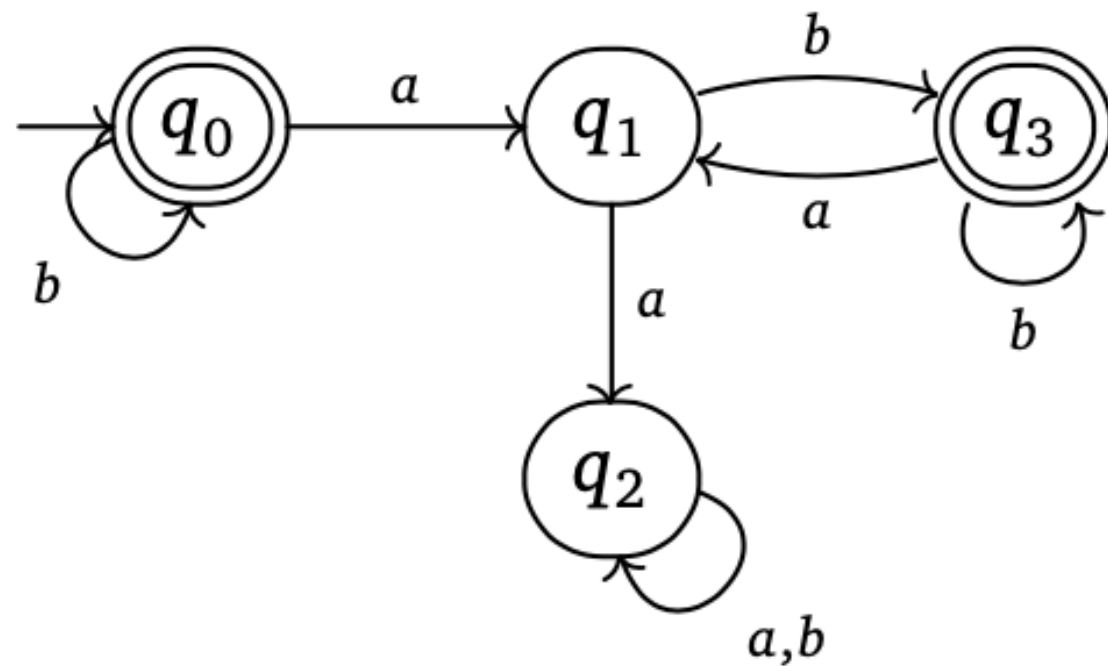
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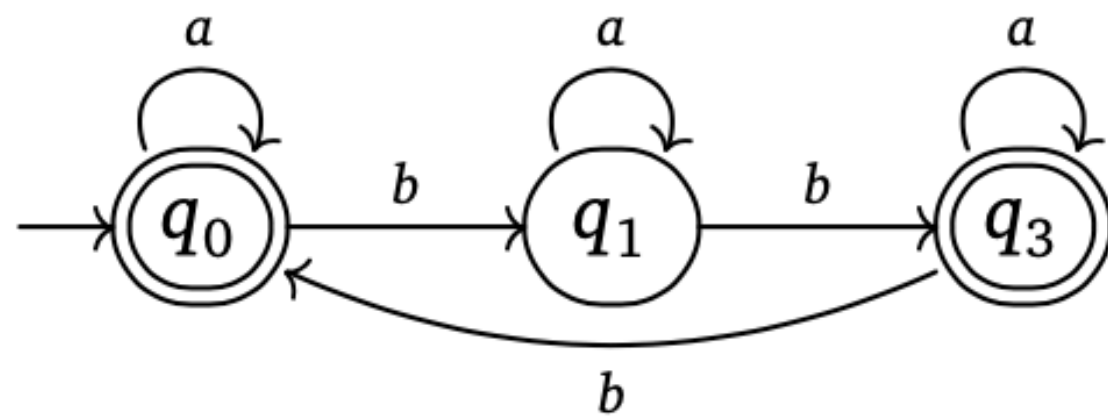
$$\mathcal{L}(p) = \{w \in A^* \mid |w|_a \text{ is odd}\}.$$



$$\mathcal{L}(q_0) = \{w \in A^* \mid w \text{ has the subword } ba\}.$$



$$\mathcal{L}(q_0) = \{w \in A^* \mid \text{every } a \text{ in } w \text{ is followed by a } b\}.$$



$$\mathcal{L}(q_0) = \{w \in A^* \mid |w|_b = 3n + 2 \text{ or } |w|_b = 3n, n \in \mathbb{N}\}.$$

Intermezzo: final coalgebra

$$\begin{array}{ccc}
 S & \xrightarrow{\quad L \quad} & 2^{A^*} \\
 \downarrow \langle o_S, t_S \rangle & & \downarrow \langle o_L, t_L \rangle \\
 2 \times S^A & \xrightarrow{\quad id \times L^A \quad} & 2 \times (2^{A^*})^A
 \end{array}$$

Kleene Algebra

$$\begin{array}{lll} e_1 + (e_2 + e_3) & = & (e_1 + e_2) + e_3 & \text{(associativity of +)} \\ e_1 + e_2 & = & e_2 + e_1 & \text{(commutativity of +)} \\ e + e & = & e & \text{(idempotency of +)} \\ e + 0 & = & e & \text{(0 is an identity of +)} \end{array}$$

$$\begin{array}{llll} e_1(e_2e_3) & = & (e_1e_2)e_3 & \text{(associativity of \cdot)} \\ e1 & = & e & = 1e \quad \text{(1 is an identity of \cdot)} \\ e0 & = & 0 & = 0e \quad \text{(0 is an annihilator of \cdot)} \end{array}$$

$$\begin{array}{lll} (e_2 + e_3)e_1 & = & e_2e_1 + e_3e_1 & \text{(right distributivity)} \\ e_1(e_2 + e_3) & = & e_1e_2 + e_1e_3 & \text{(left distributivity)} \\ e^*e + \lambda & = & e^* & \\ ee^* + \lambda & = & e^* & \end{array}$$

Exercise

1. $x^*x^* = x^*$

2. $x^* = x^{**}$

3. $(x+y)^* = (x^*y)^*x^*$ denesting

4. $x(yx)^* = (xy)^*x$ sliding

5. $xy=yz \Rightarrow x^*y = yz^*$

Kleene Algebra, examples

- Regular languages
 - **+ is union**
 - **; is pointwise concatenation**
 - *** is iteration**

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 - **+ and ; lifted to usual matrices ops**
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$$\begin{bmatrix} a & b \\ c & d \end{bmatrix}^* = \begin{bmatrix} (a + bd^*c)^* & (a + bd^*c)^*bd^* \\ (d + ca^*b)^*ca^* & (d + ca^*b)^* \end{bmatrix}$$

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Important
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Important for
automata
representations

$$\begin{bmatrix} a & b \\ c & d \end{bmatrix}^* = \begin{bmatrix} (a + bd^*c)^* & (a + bd^*c)^*bd^* \\ (d + ca^*b)^*ca^* & (d + ca^*b)^* \end{bmatrix}$$

Kleene's Theorem

Theorem (Kleene'52): Let L be a subset of A^* . TFAE:

1. L is regular
2. L is accepted by a deterministic finite automaton

Proof

1 \Rightarrow 2 : Syntactic Brzozowski derivatives

2 \Rightarrow 1 : State elimination

Brzozowski Derivatives

$$r, r_1, r_2 ::= \underline{1} \mid \underline{0} \mid a \in A \mid r_1 + r_2 \mid r_1 r_2 \mid r^*$$

Brzowski Derivatives

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$$o_{\mathcal{R}}(\underline{0}) = 0$$

$$o_{\mathcal{R}}(\underline{1}) = 1$$

$$o_{\mathcal{R}}(a) = 0$$

$$o_{\mathcal{R}}(r_1 + r_2) = o_{\mathcal{R}}(r_1) \vee o_{\mathcal{R}}(r_2)$$

$$o_{\mathcal{R}}(r_1 r_2) = o_{\mathcal{R}}(r_1) \wedge o_{\mathcal{R}}(r_2)$$

$$o_{\mathcal{R}}(r^*) = 1$$

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$$(\underline{0})_a = \underline{0}$$

$$(\underline{1})_a = \underline{0}$$

$$(a)_{a'} = \begin{cases} \underline{1} & \text{if } a = a' \\ \underline{0} & \text{if } a \neq a' \end{cases}$$

$$(r_1 + r_2)_a = (r_1)_a + (r_2)_a$$

$$(r_1 r_2)_a = \begin{cases} (r_1)_a r_2 & \text{if } o_{\mathcal{R}}(r_1) = 0 \\ (r_1)_a r_2 + (r_2)_a & \text{otherwise} \end{cases}$$

$$(r^*)_a = r_a r^*$$

Are we done?

$$(a^*)^*$$

$$\begin{aligned}
 ((a^*)^*)_a &= (\underline{1}a^*)(a^*)^* \\
 ((\underline{1}a^*)(a^*)^*)_a &= (\underline{0}a^* + \underline{1}a^*)(a^*)^* + (\underline{1}a^*)(a^*)^* \\
 ((\underline{0}a^* + \underline{1}a^*)(a^*)^* + (\underline{1}a^*)(a^*)^*)_a &= ((\underline{0}a^* + \underline{0}a^* + \underline{1}a^*)(a^*)^* + (\underline{1}a^*)(a^*)^*) + ((\underline{1}a^*)(a^*)^*)_a \\
 &\vdots
 \end{aligned}$$

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$$\begin{aligned}
 ((a^*)^*)_a &= (\underline{1}a^*)(a^*)^* && \text{NOT FINITE!} \\
 ((\underline{1}a^*)(a^*)^*)_a &= (\underline{0}a^* + \underline{1}a^*)(a^*)^* + (\underline{1}a^*)(a^*)^* \\
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 &\vdots
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 &\vdots
 \end{aligned}$$

Theorem (Brzozowski): Let r be a regular expression. The set of syntactic Brzozowski derivatives is finite if it taken modulo ACI.

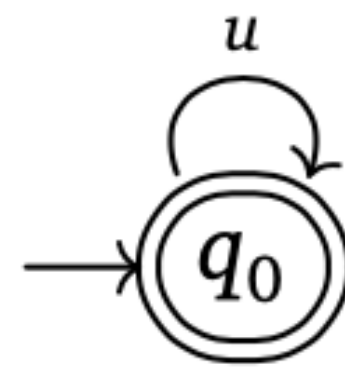
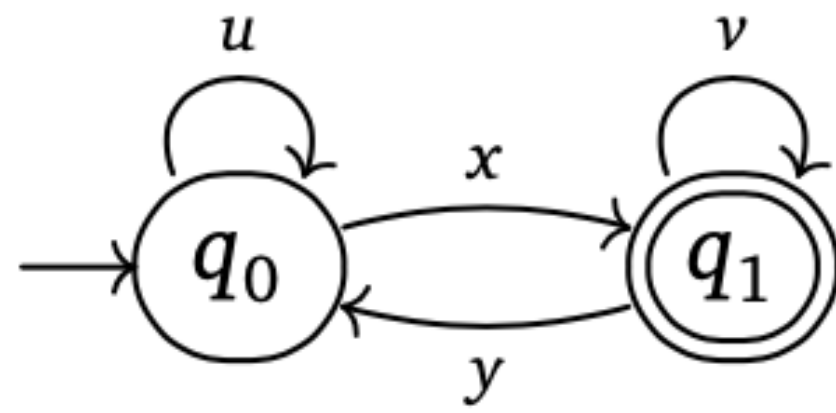
Intermezzo : final coalgebra

$$\begin{array}{ccc}
 \mathcal{R}(A) & \xrightarrow{\quad L \quad} & 2^{A^*} \\
 \downarrow \langle o_{\mathcal{R}}, t_{\mathcal{R}} \rangle & & \downarrow \langle o_L, t_L \rangle \\
 2 \times (\mathcal{R}(A))^A & \xrightarrow{\quad id \times L^A \quad} & 2 \times (2^{A^*})^A
 \end{array}$$

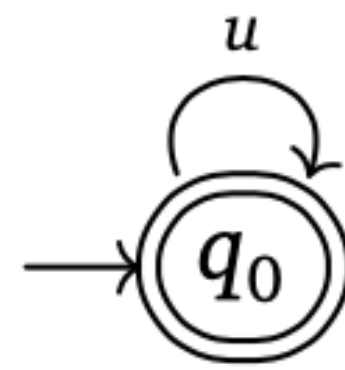
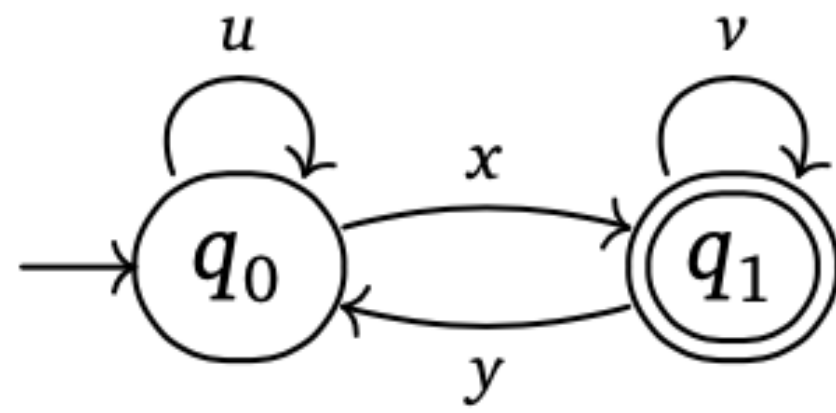
Alternative proof $1 \Rightarrow 2$

Thompson + epsilon-elim + subset construction

State Elimination

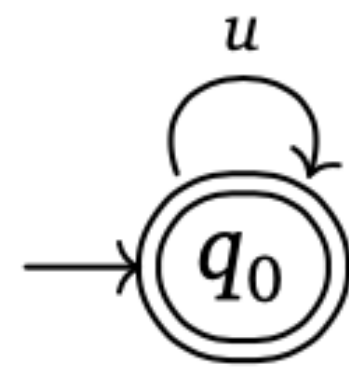
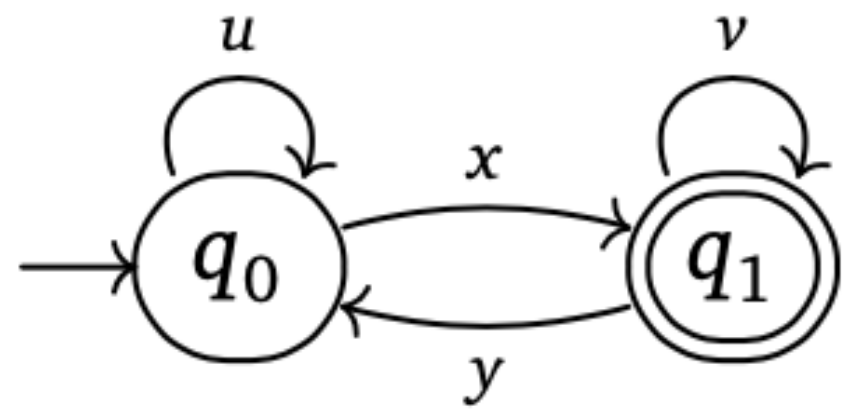


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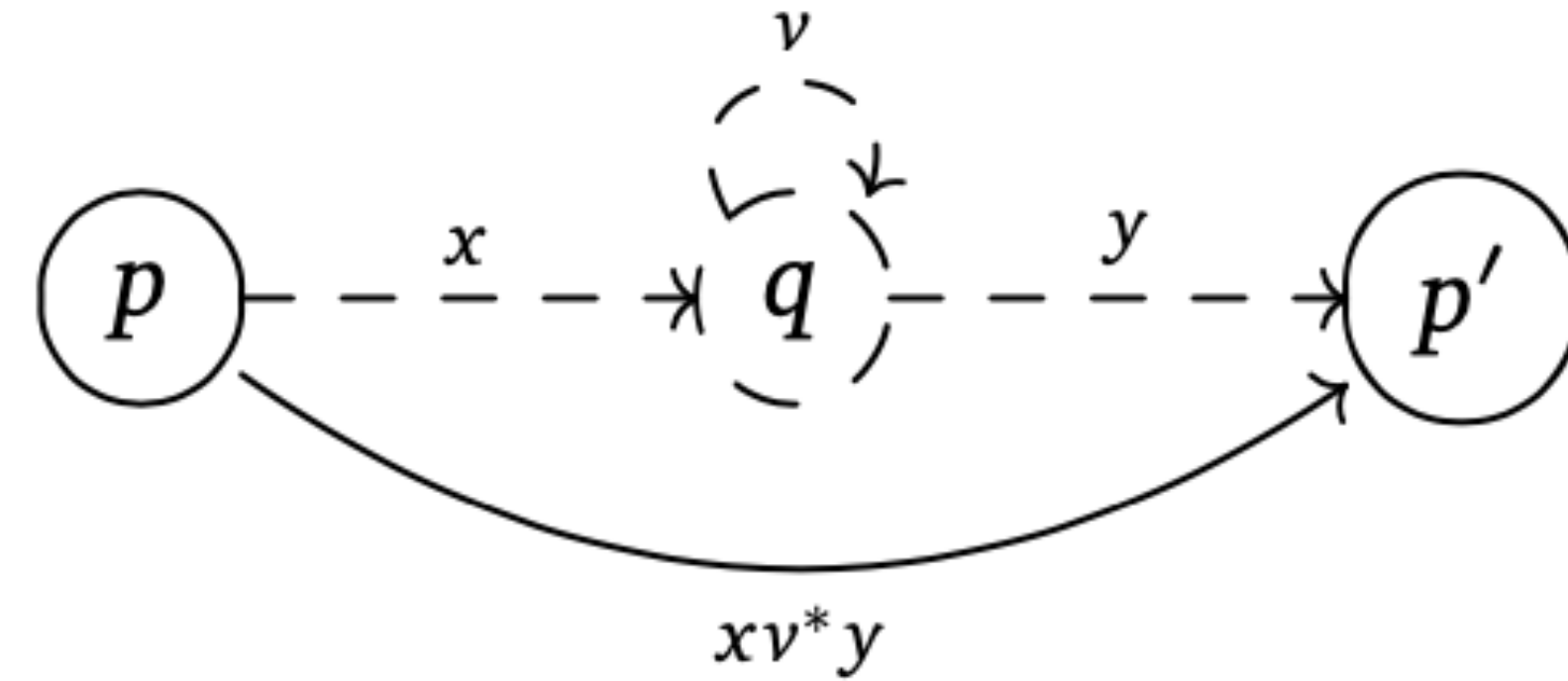


$$u^*x(v + yu^*x)^*$$

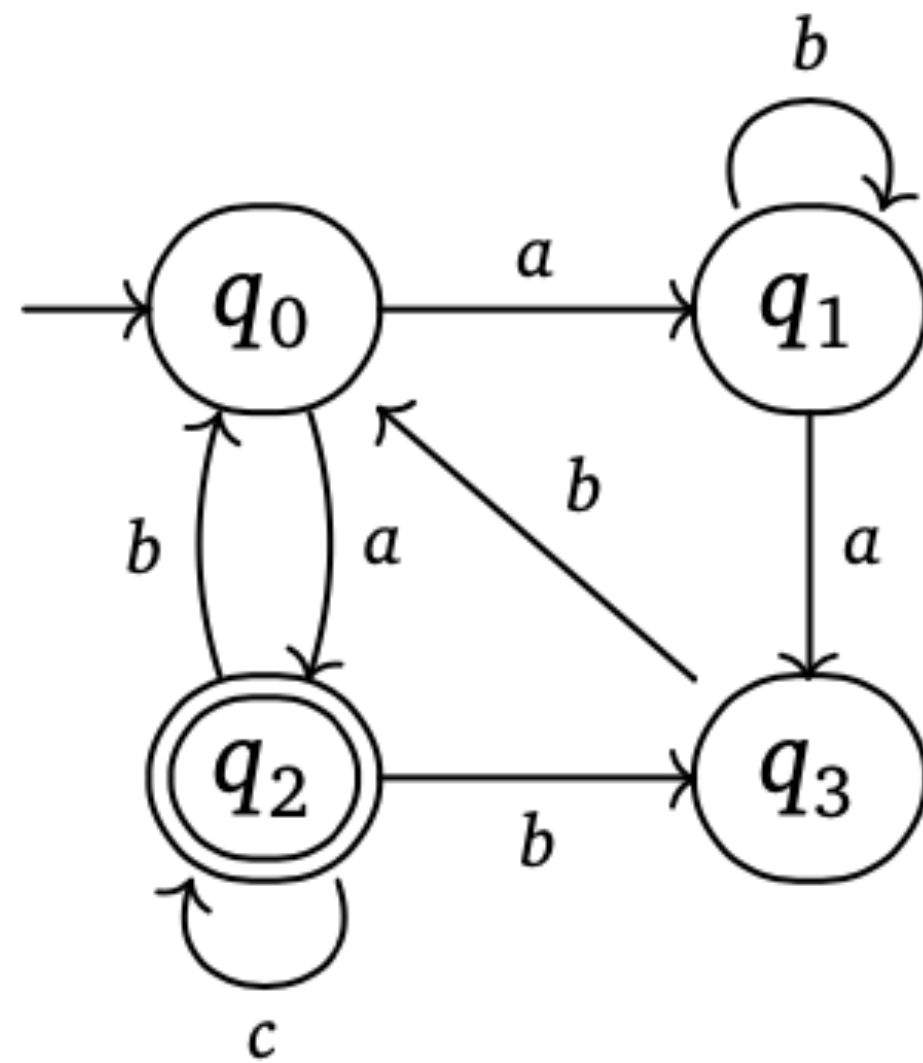
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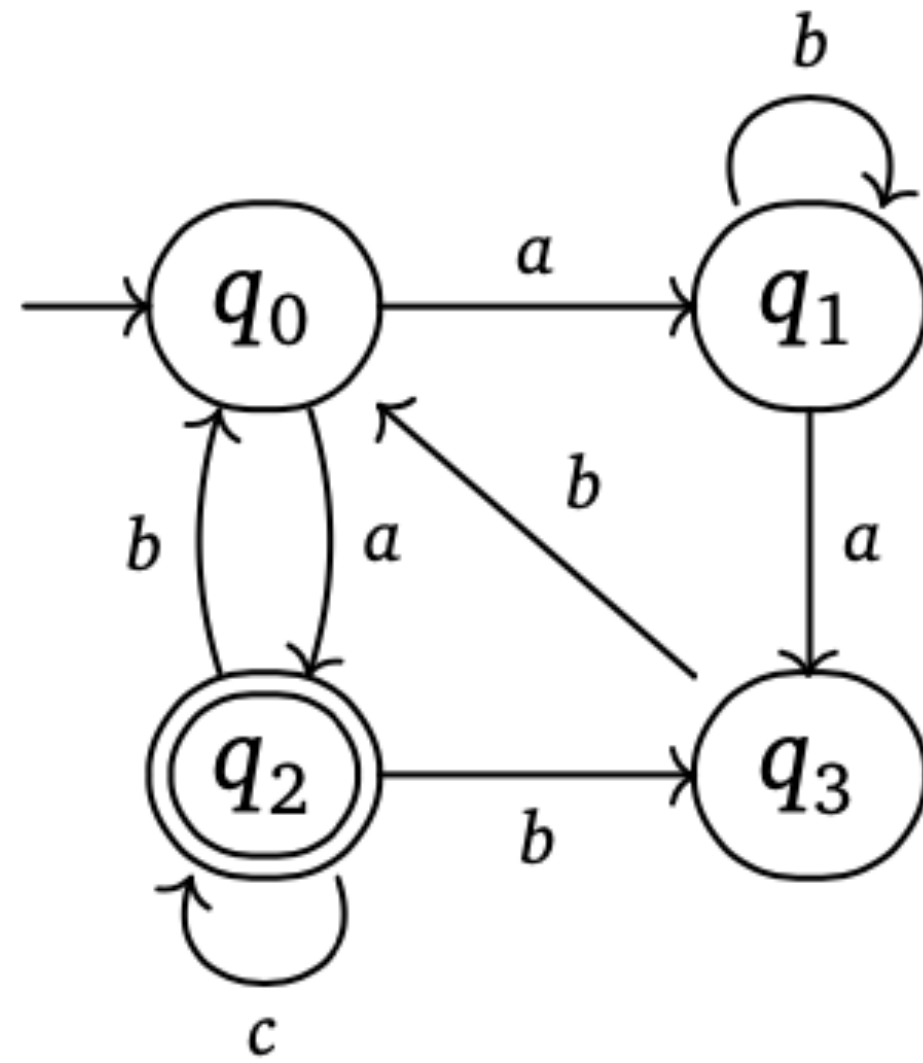
Exercise



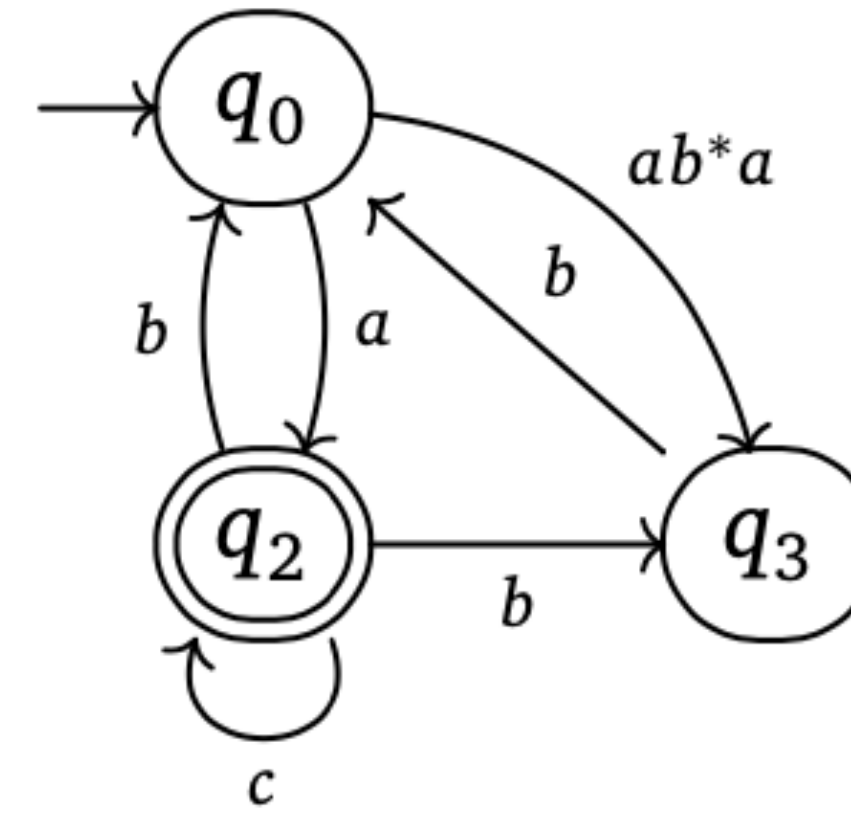
Delete q_1



Exercise



Delete q_1



Lecture 2

Alternative proof 2 \Rightarrow 1

Solving systems of equations

$$x \equiv r_1 + r_2 x$$

Alternative proof 2 \Rightarrow 1

Solving systems of equations

$$x \equiv r_1 + r_2 x$$

$$r_s \equiv \sum_{a \in A} a r_{s_a} + \underline{o_S(s)}$$

Alternative proof 2 \Rightarrow 1

Solving systems of equations

$$x \equiv r_1 + r_2 x$$

$$r_s \equiv \sum_{a \in A} a r_{s_a} + \underline{o_S(s)}$$

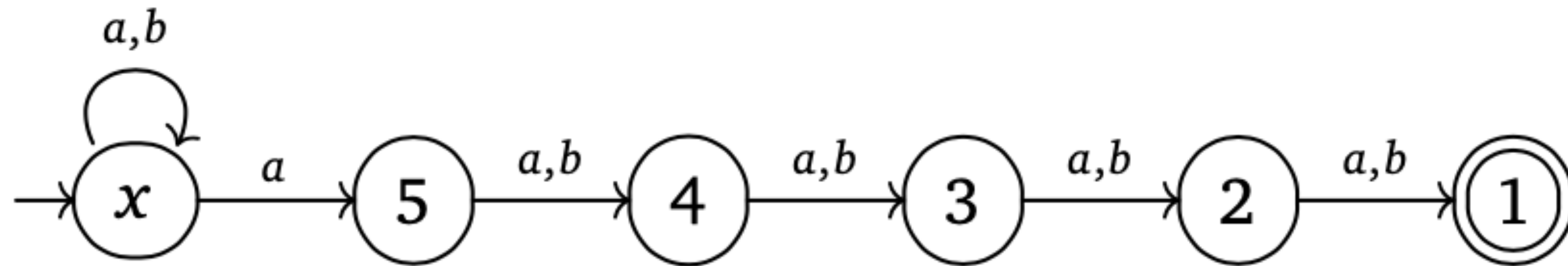
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NFAs

$(a + b)^*a(a + b)(a + b)(a + b)(a + b)$

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Antimirov Derivatives

Context

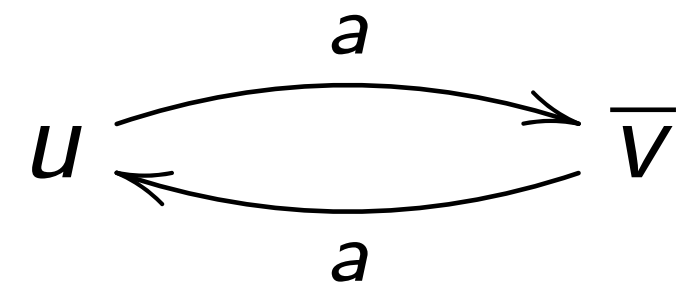
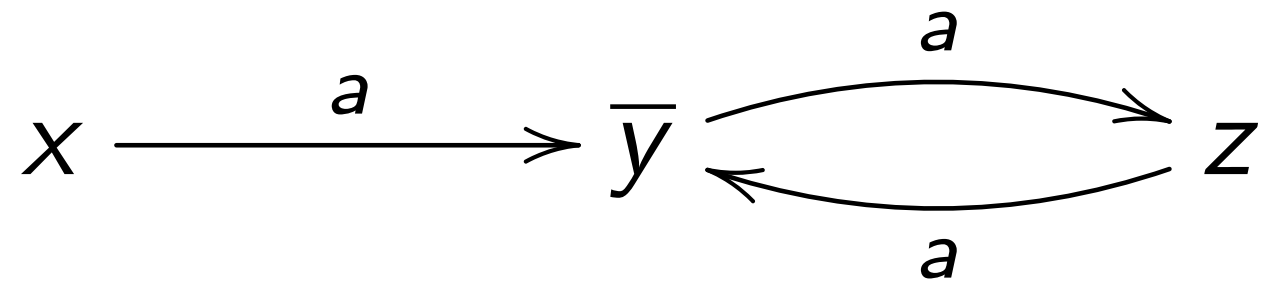
Tools and proof techniques for systems equivalence

Methodology:

1. First do it naively
2. Then improve the associated proof method

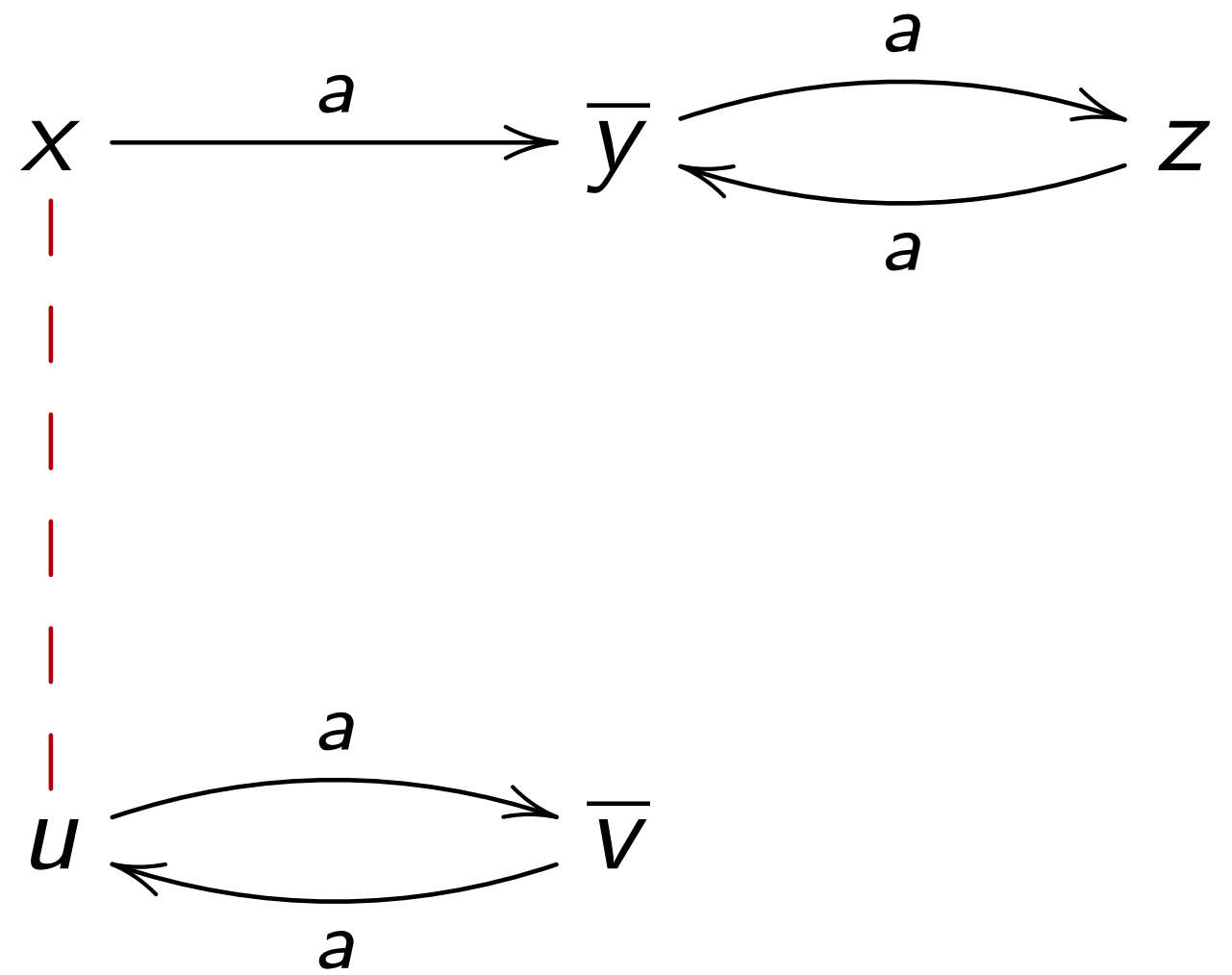
Deterministic finite automata

The states x and u are language equivalent



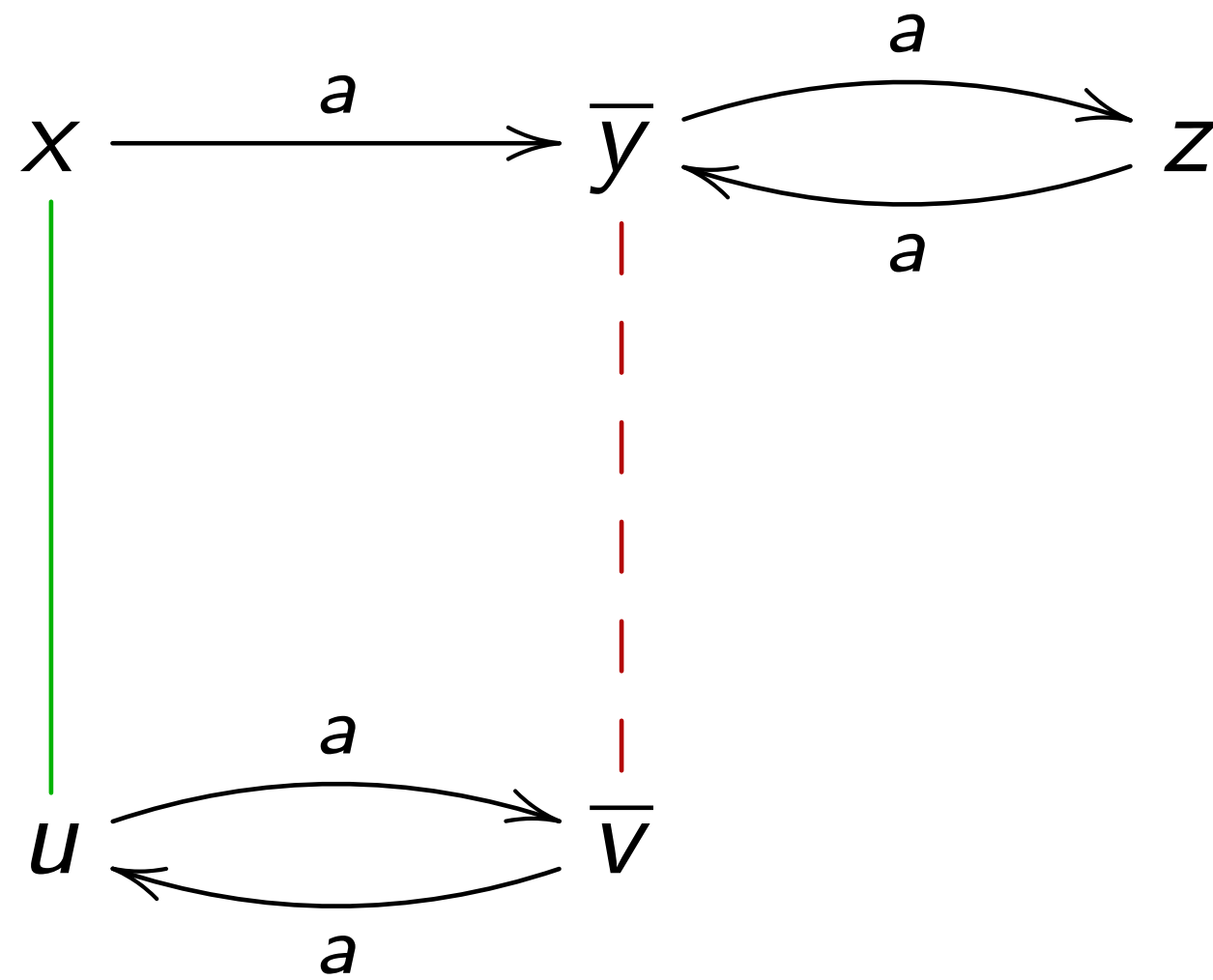
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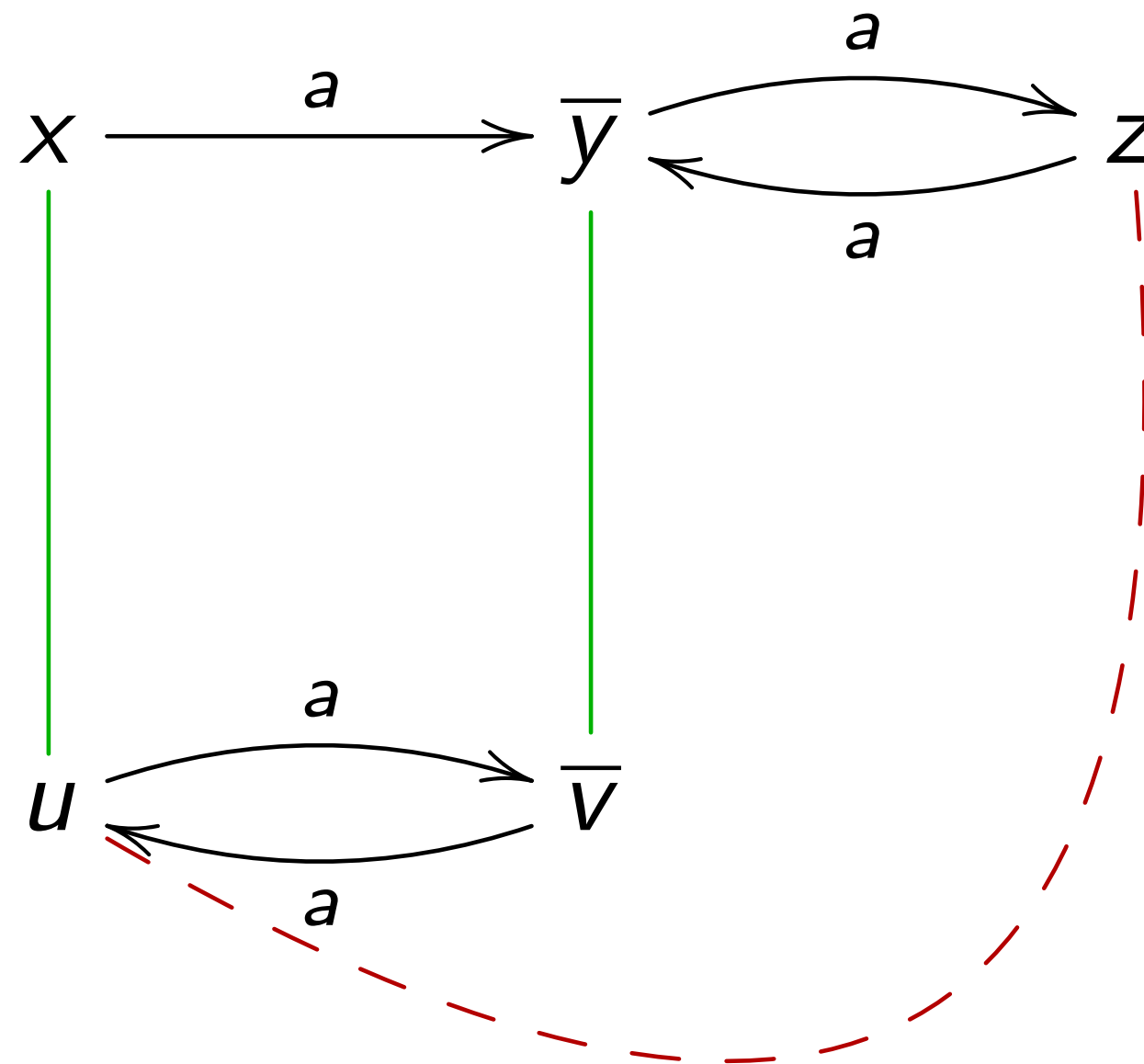
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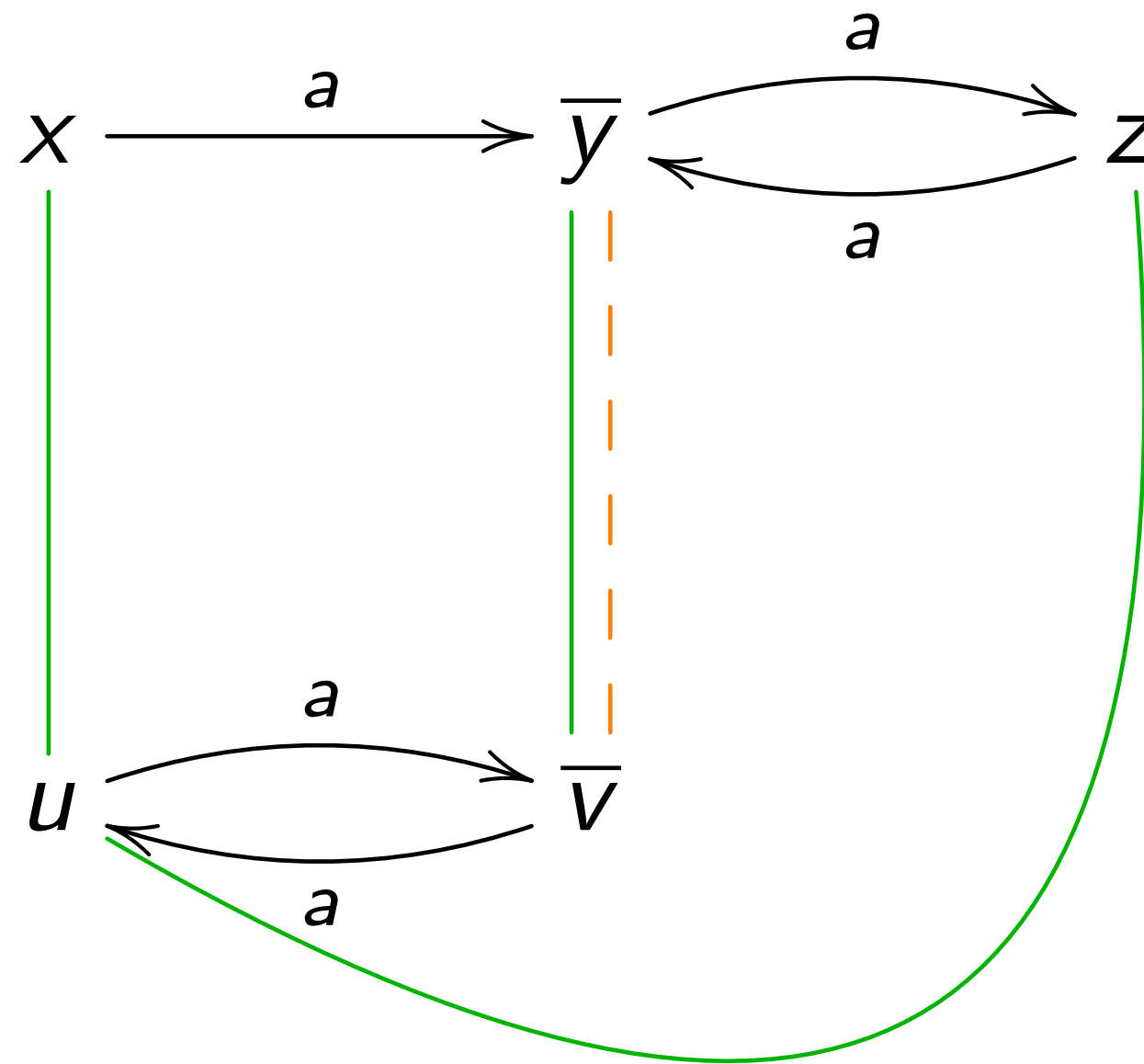
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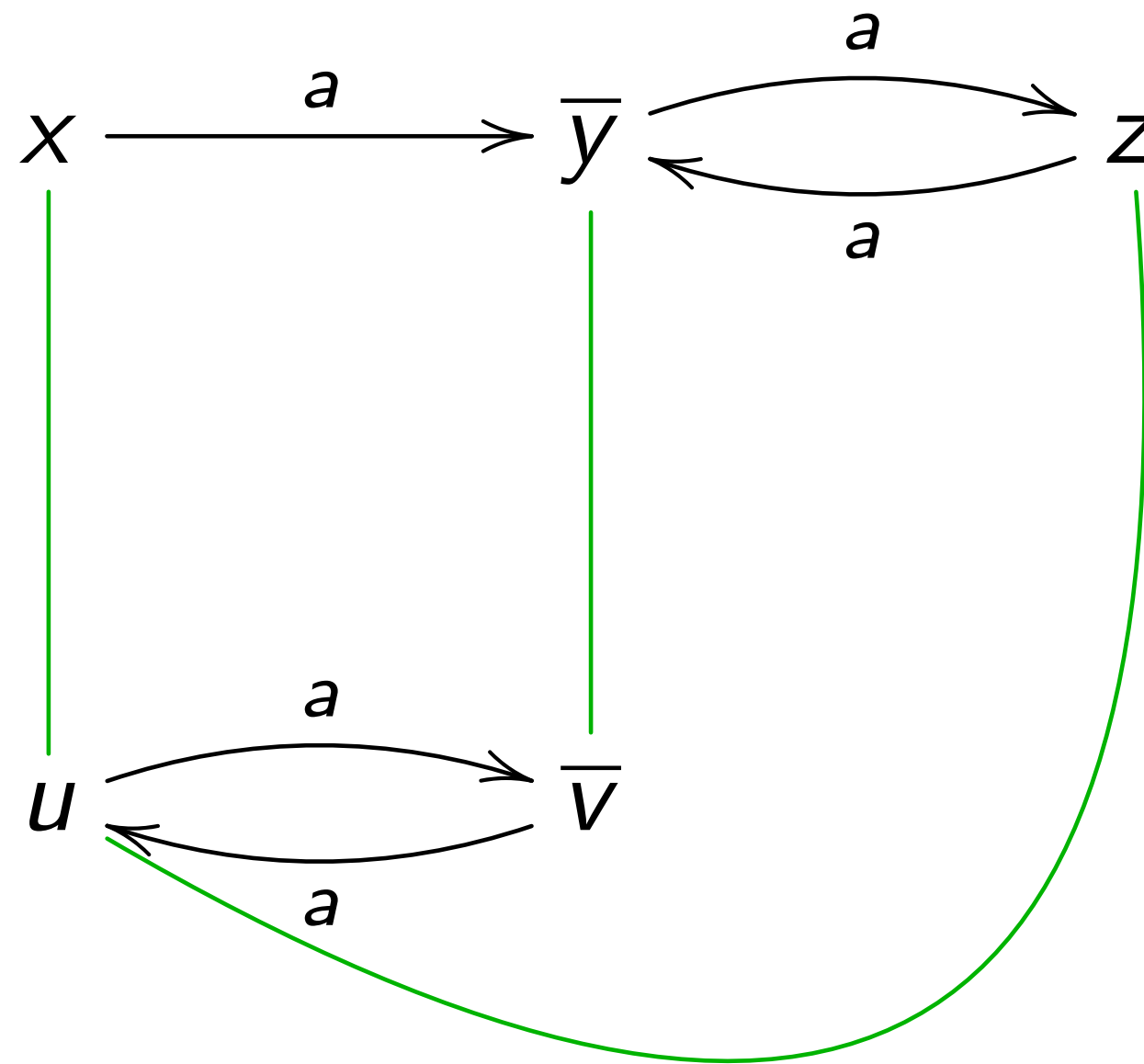
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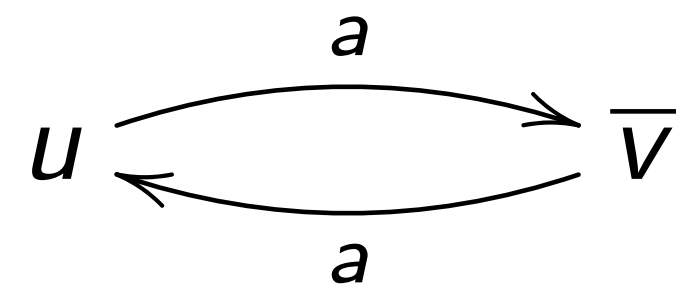
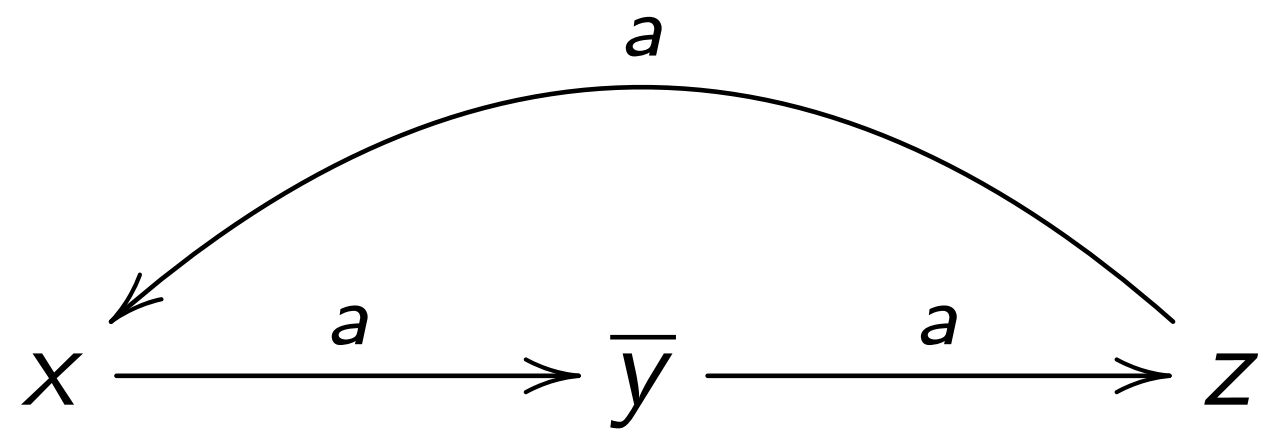
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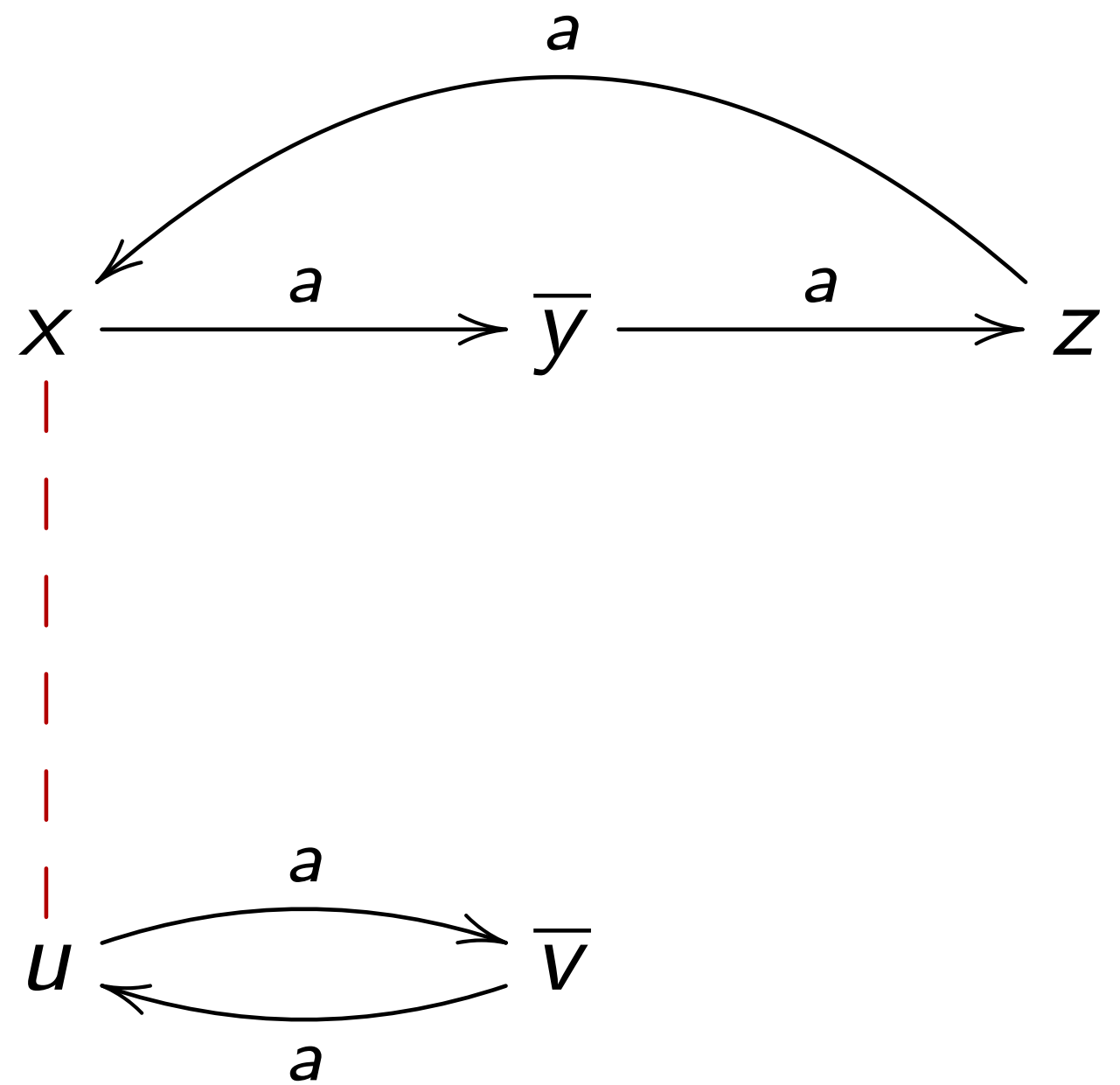
Deterministic finite automata

x and u are **not** equivalent



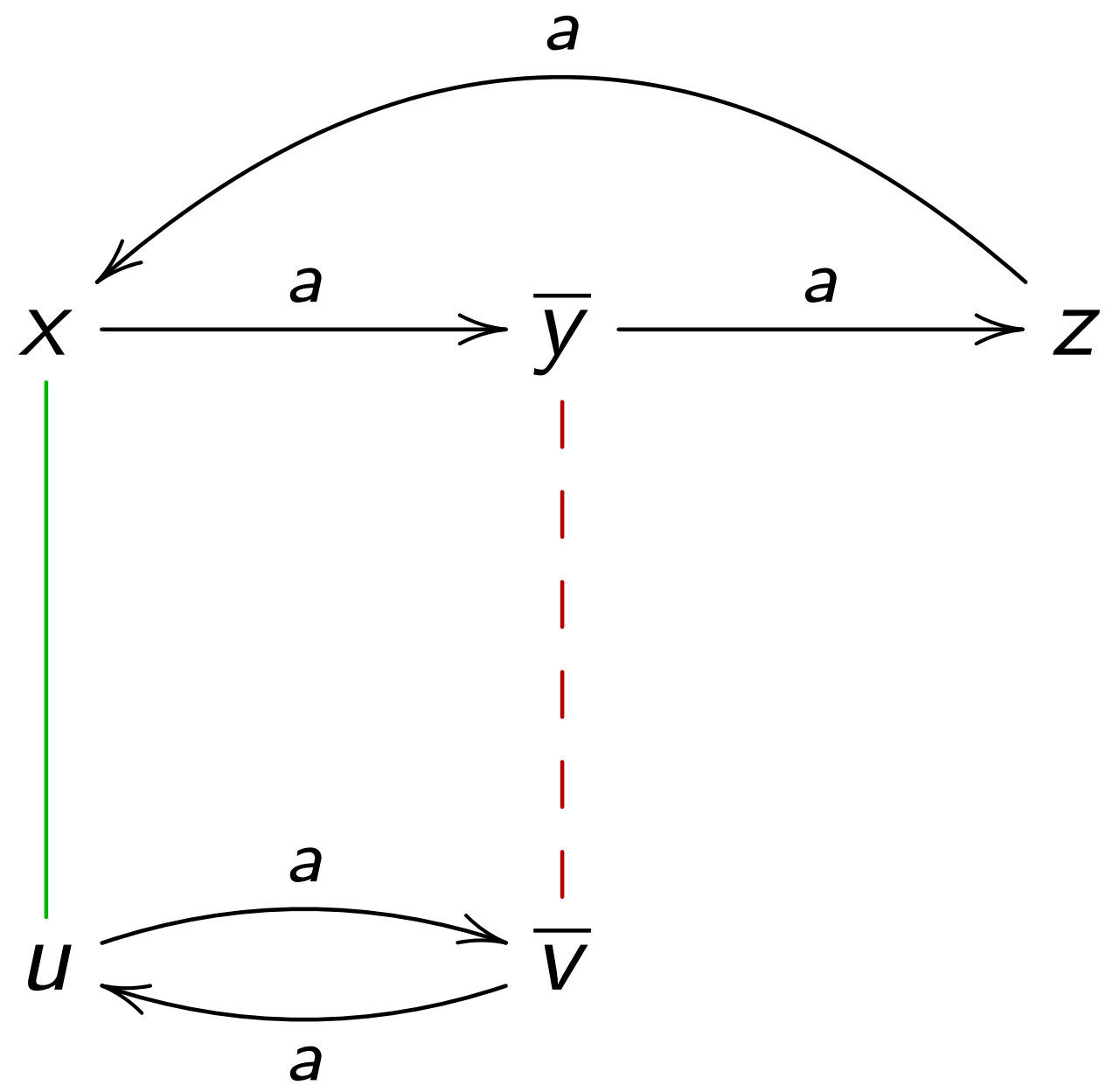
Deterministic finite automata

x and u are **not** equivalent



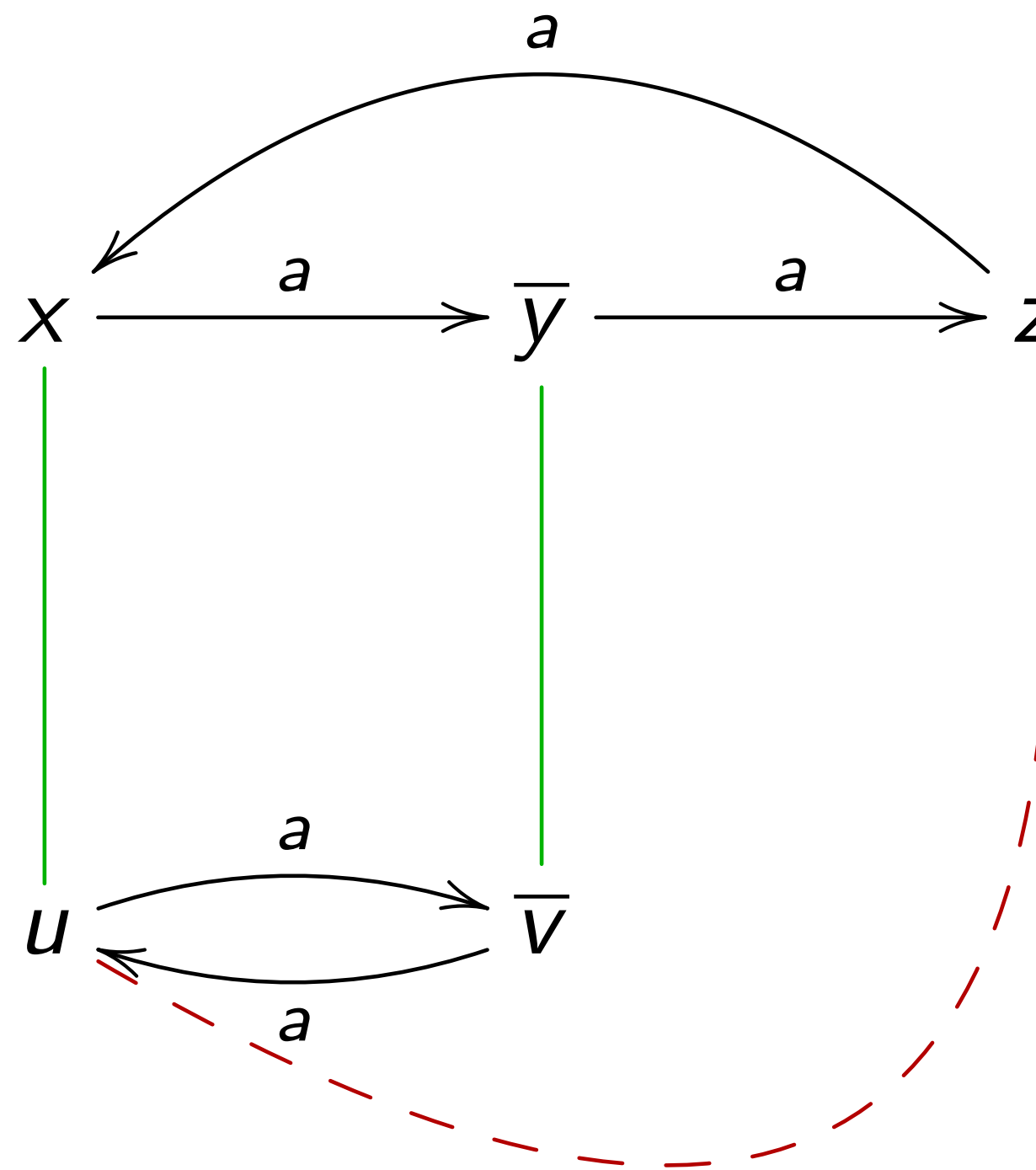
Deterministic finite automata

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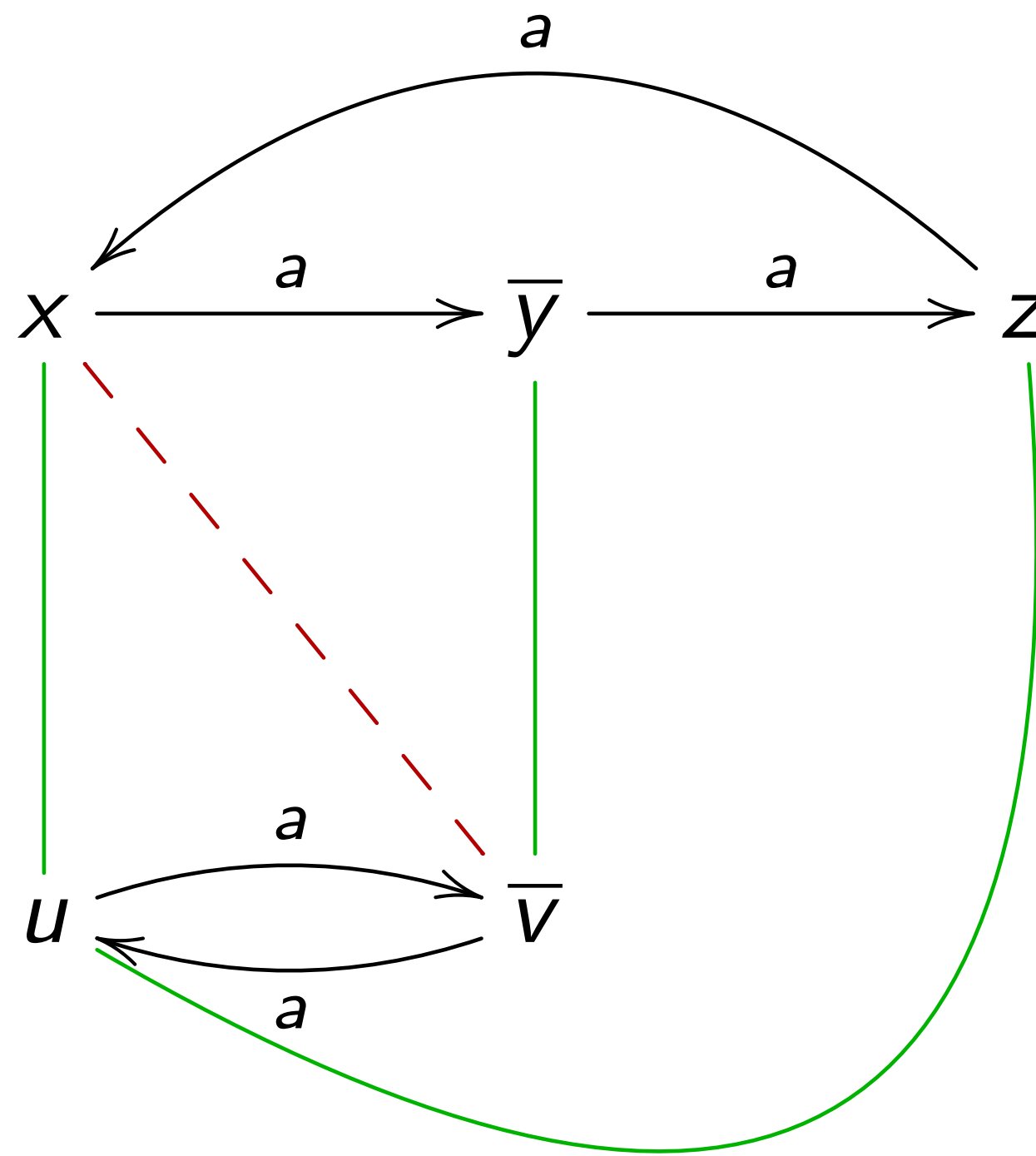
Deterministic finite automata

x and u are **not** equivalent



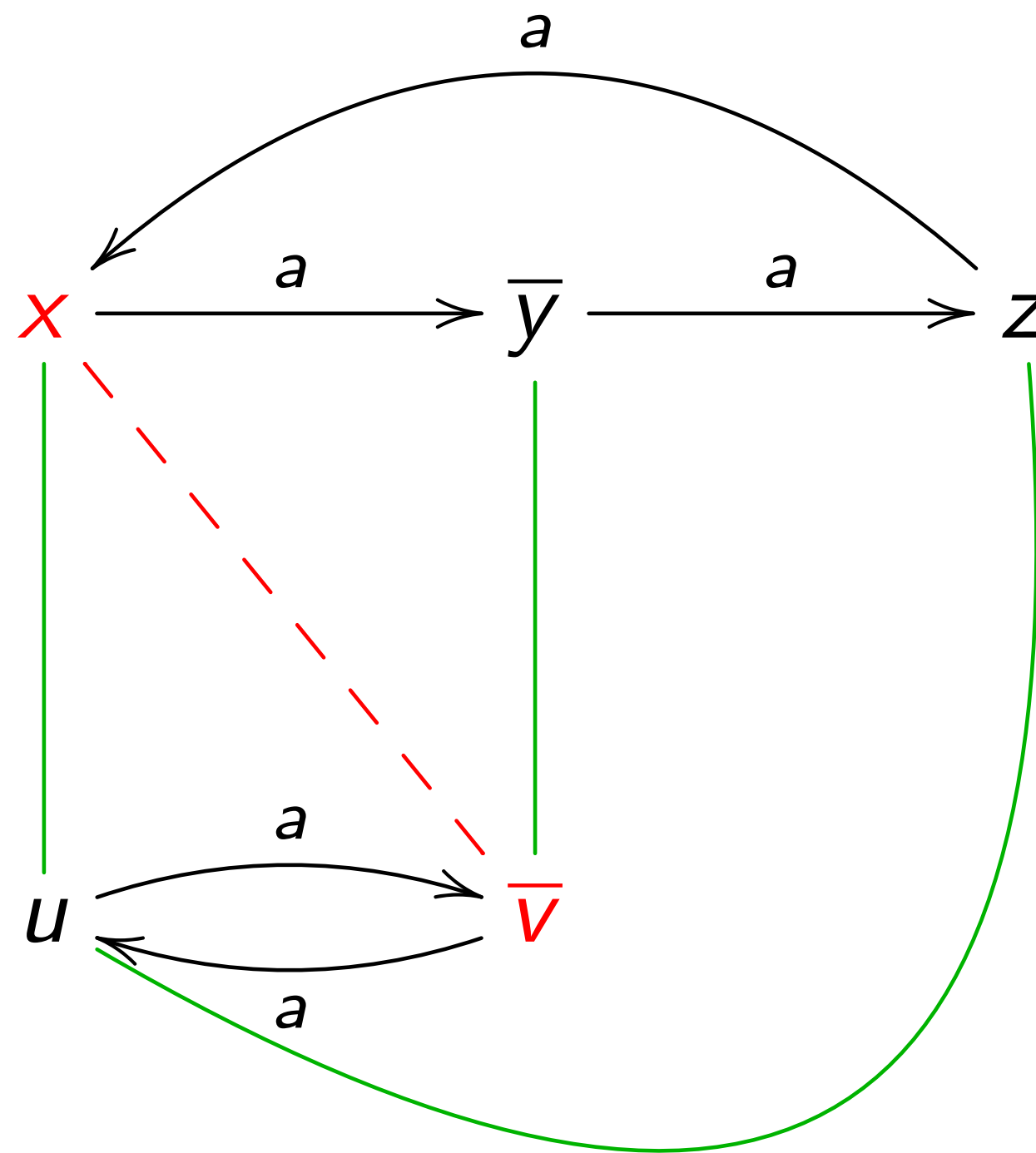
Deterministic finite automata

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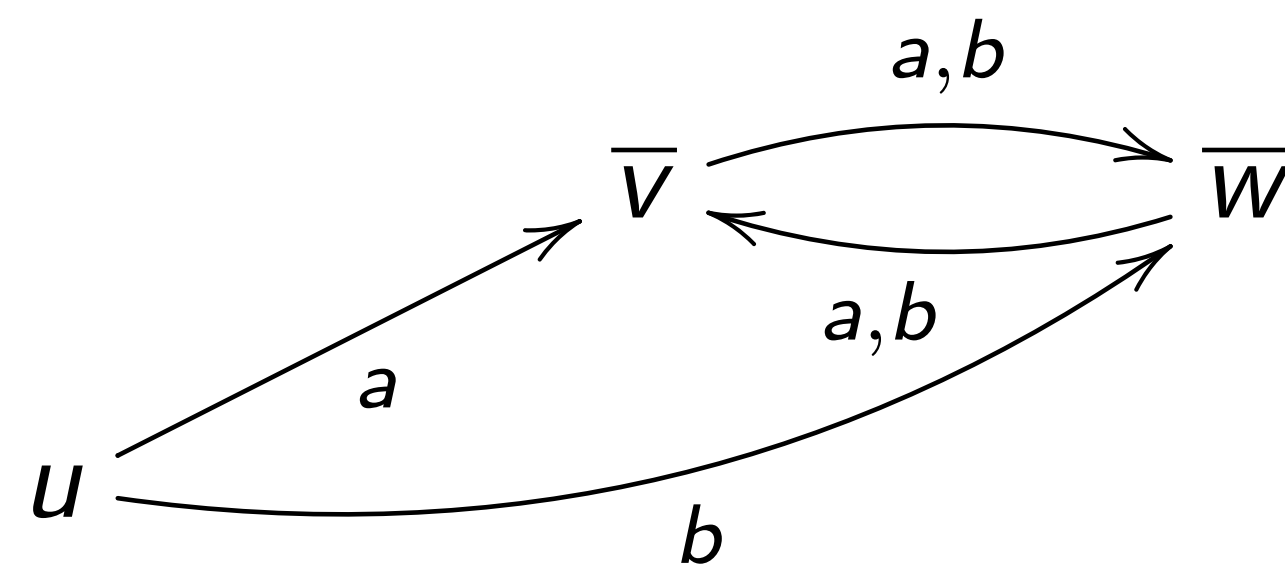
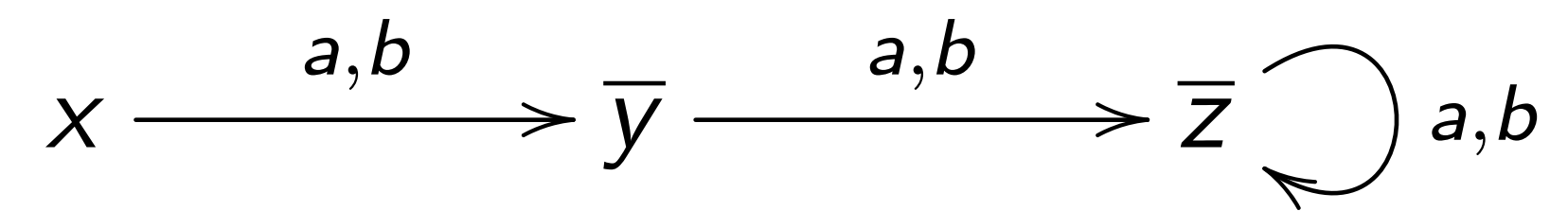
Deterministic finite automata

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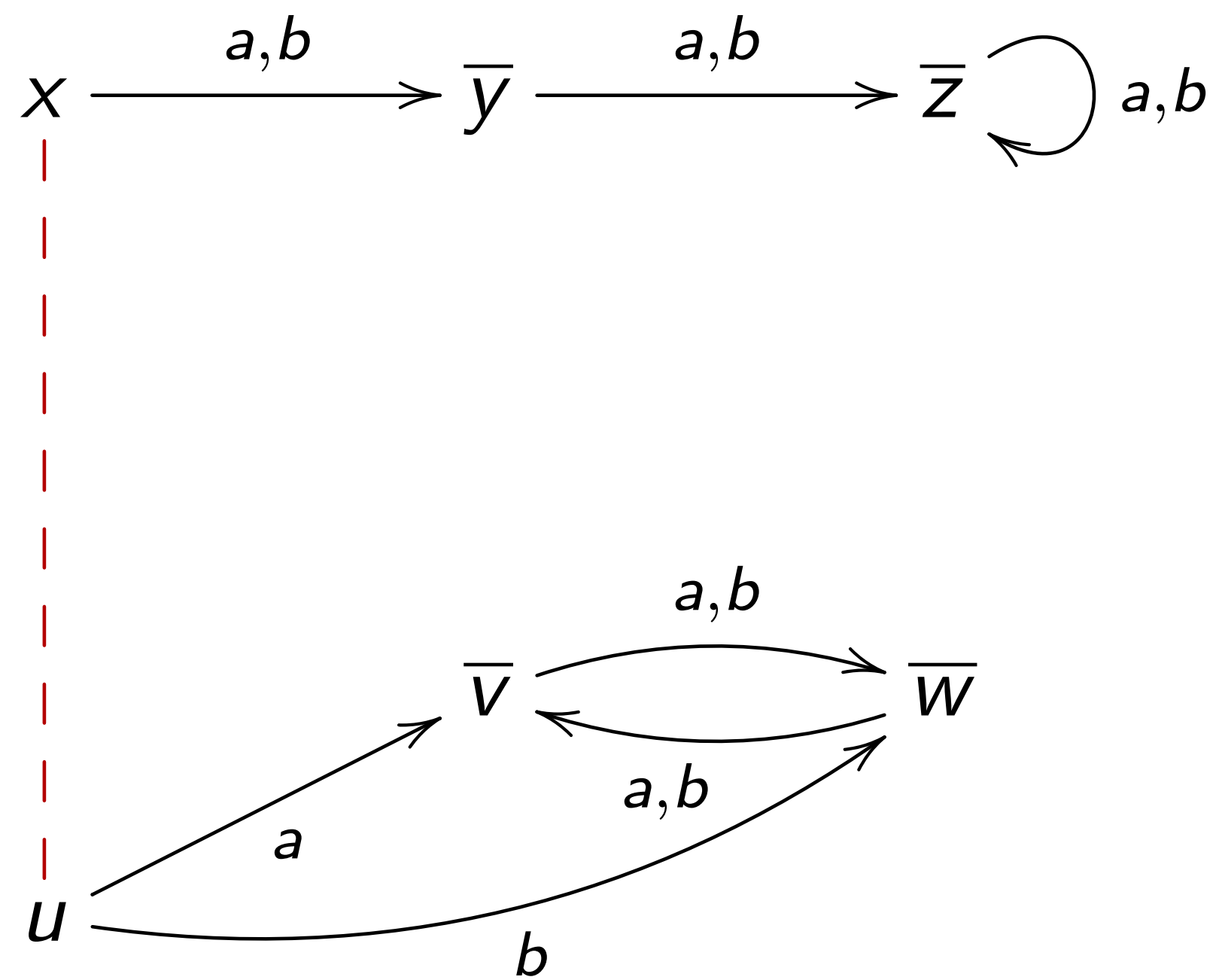
Deterministic finite automata

Last example, with two letters



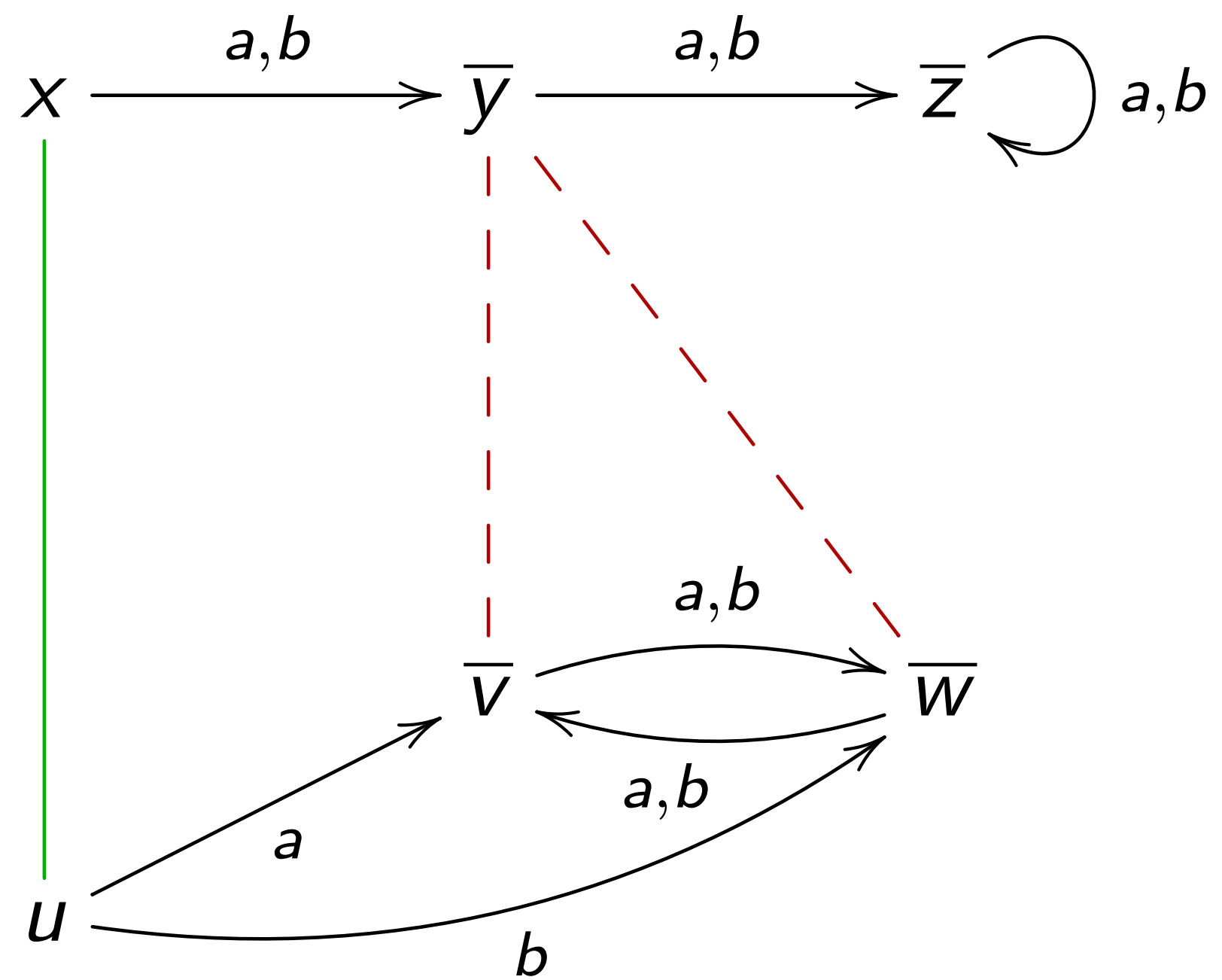
Deterministic finite automata

Last example, with two letters



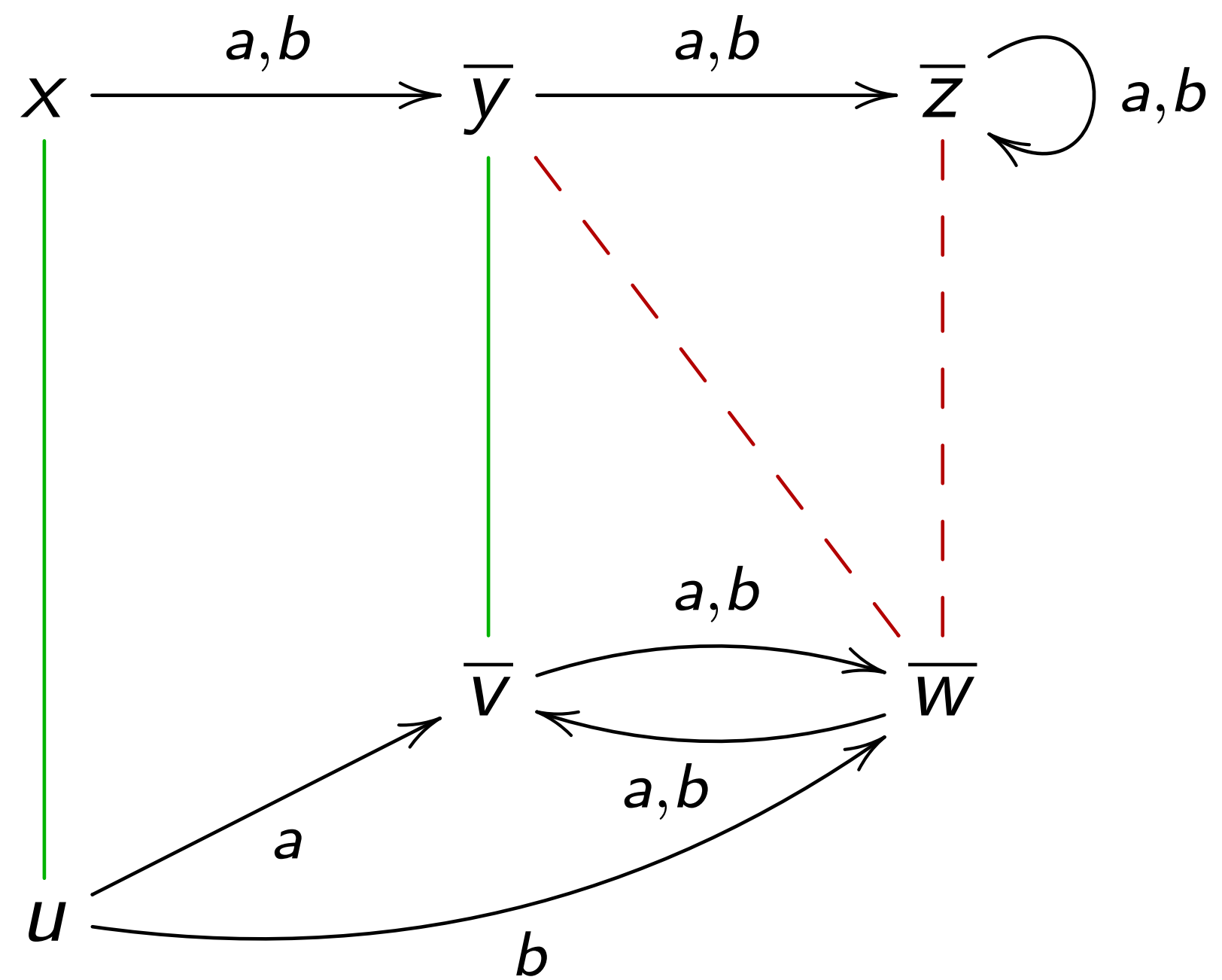
Deterministic finite automata

Last example, with two letters



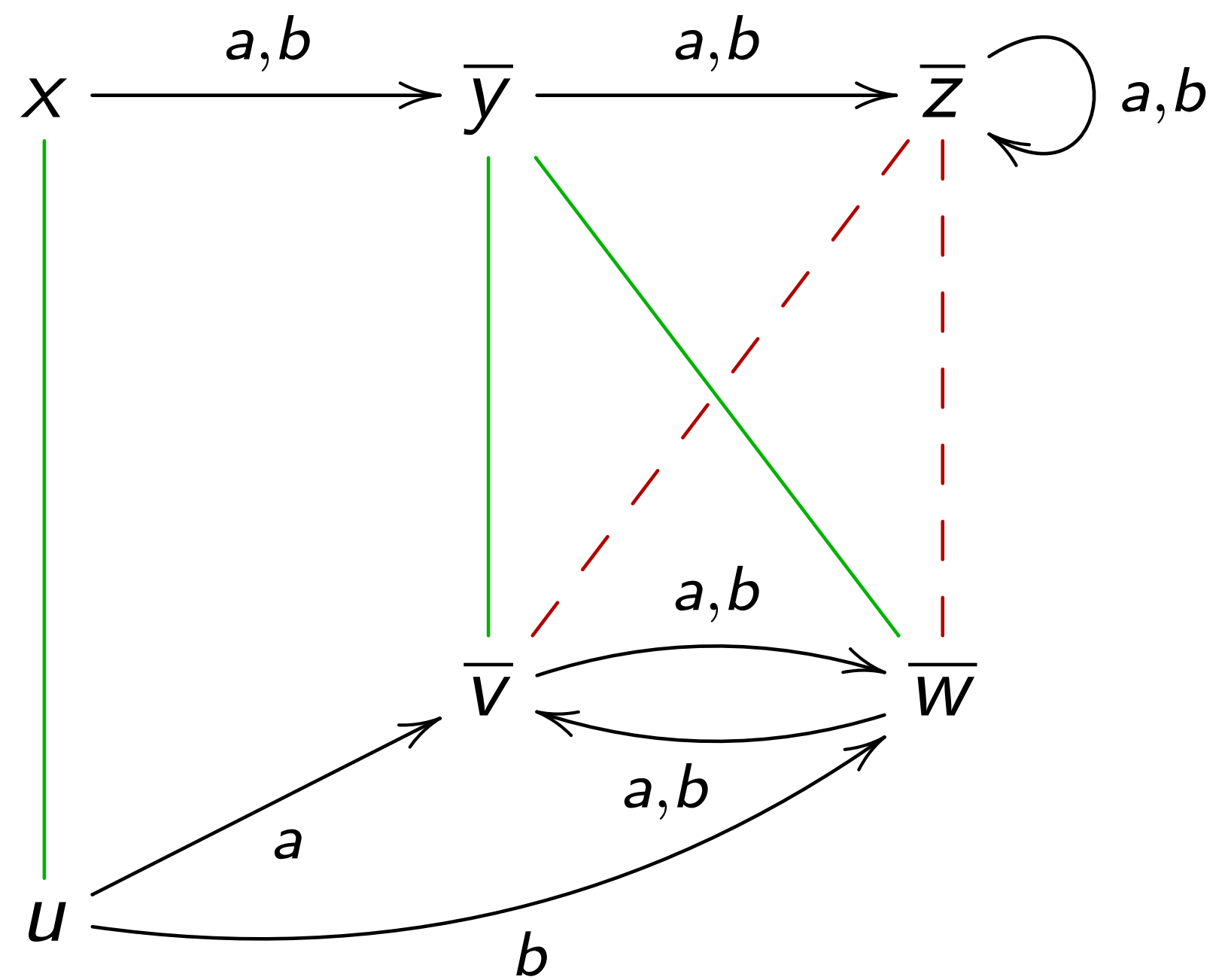
Deterministic finite automata

Last example, with two letters



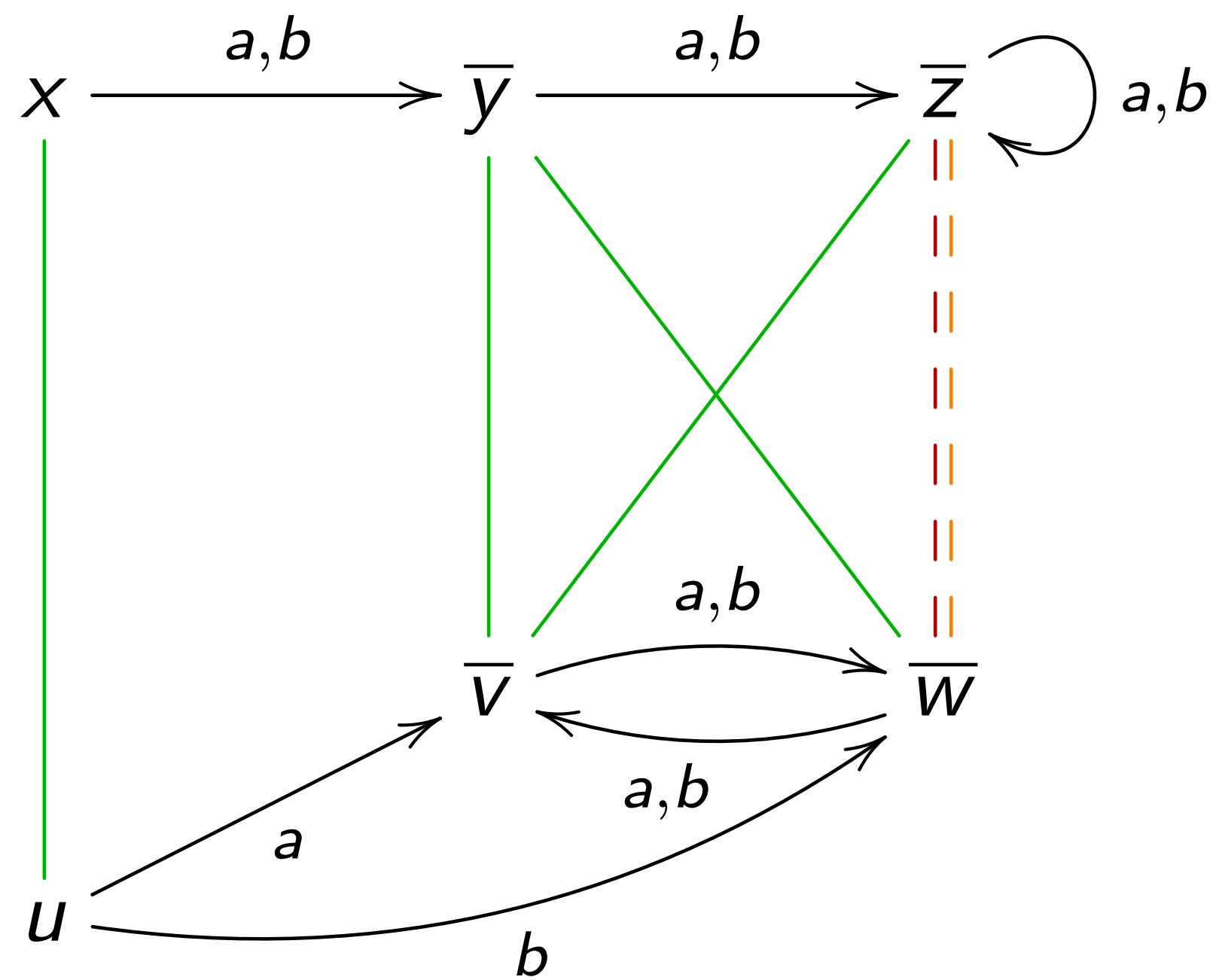
Deterministic finite automata

Last example, with two letters



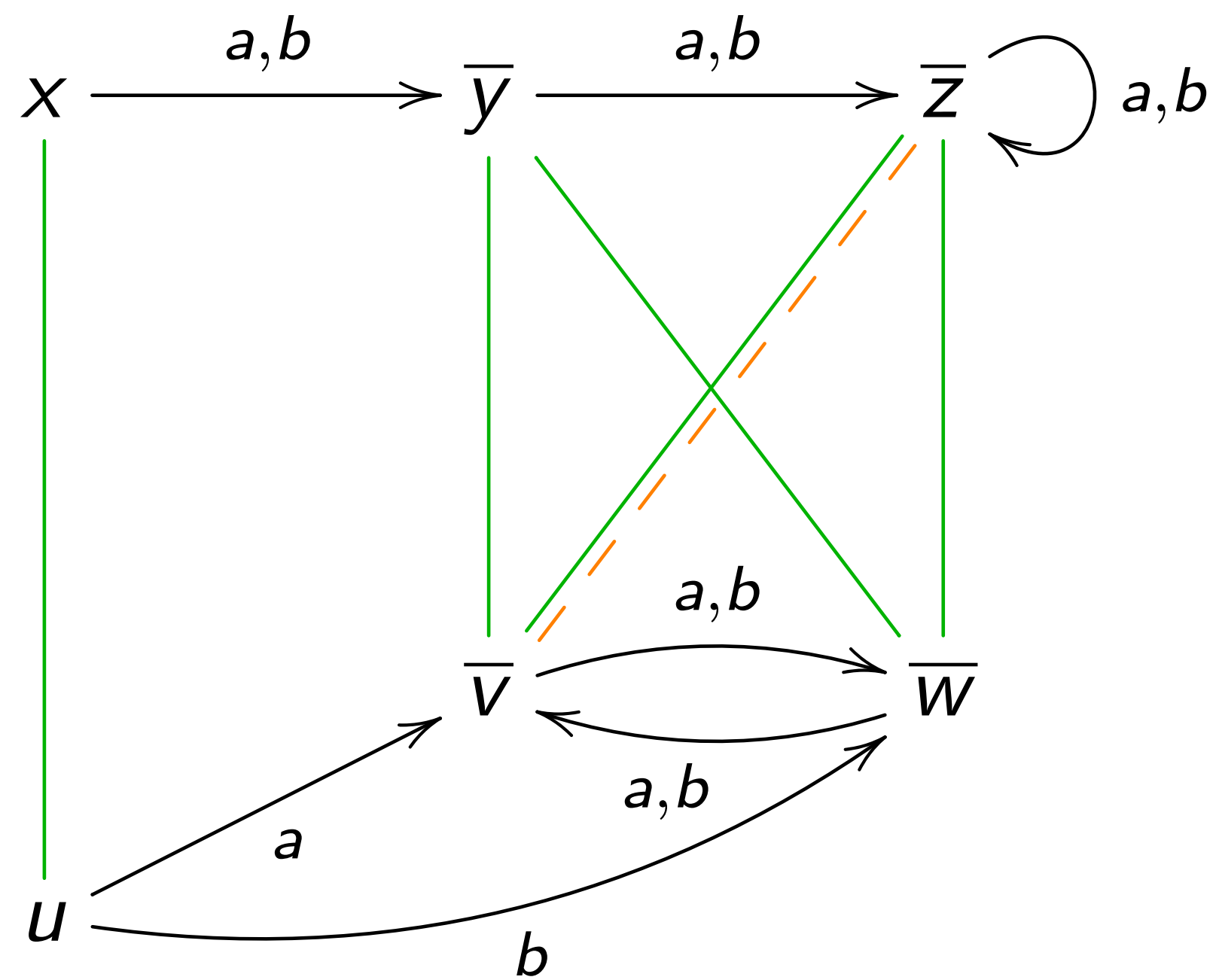
Deterministic finite automata

Last example, with two letters



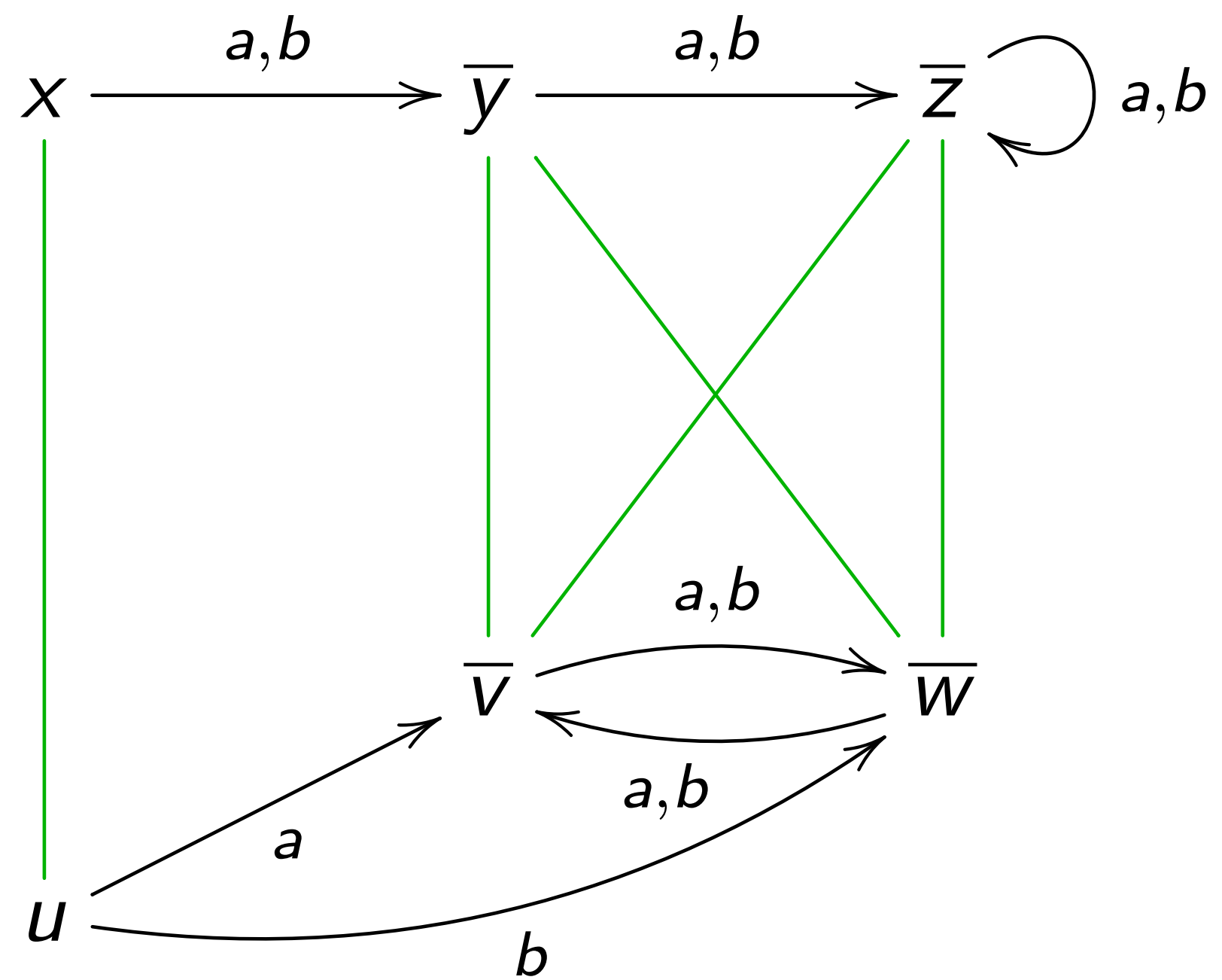
Deterministic finite automata

Last example, with two letters



Deterministic finite automata

Last example, with two letters



Correctness

- ▶ A relation R is a **proof of equivalence** (bisimulation) if $x R y$ entails
 - ▶ $o(x) = o(y)$;
 - ▶ for all a , $t_a(x) R t_a(y)$.

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- ▶ *Theorem:* $L(x) = L(y)$ iff there exists a bisimulation R with $x R y$

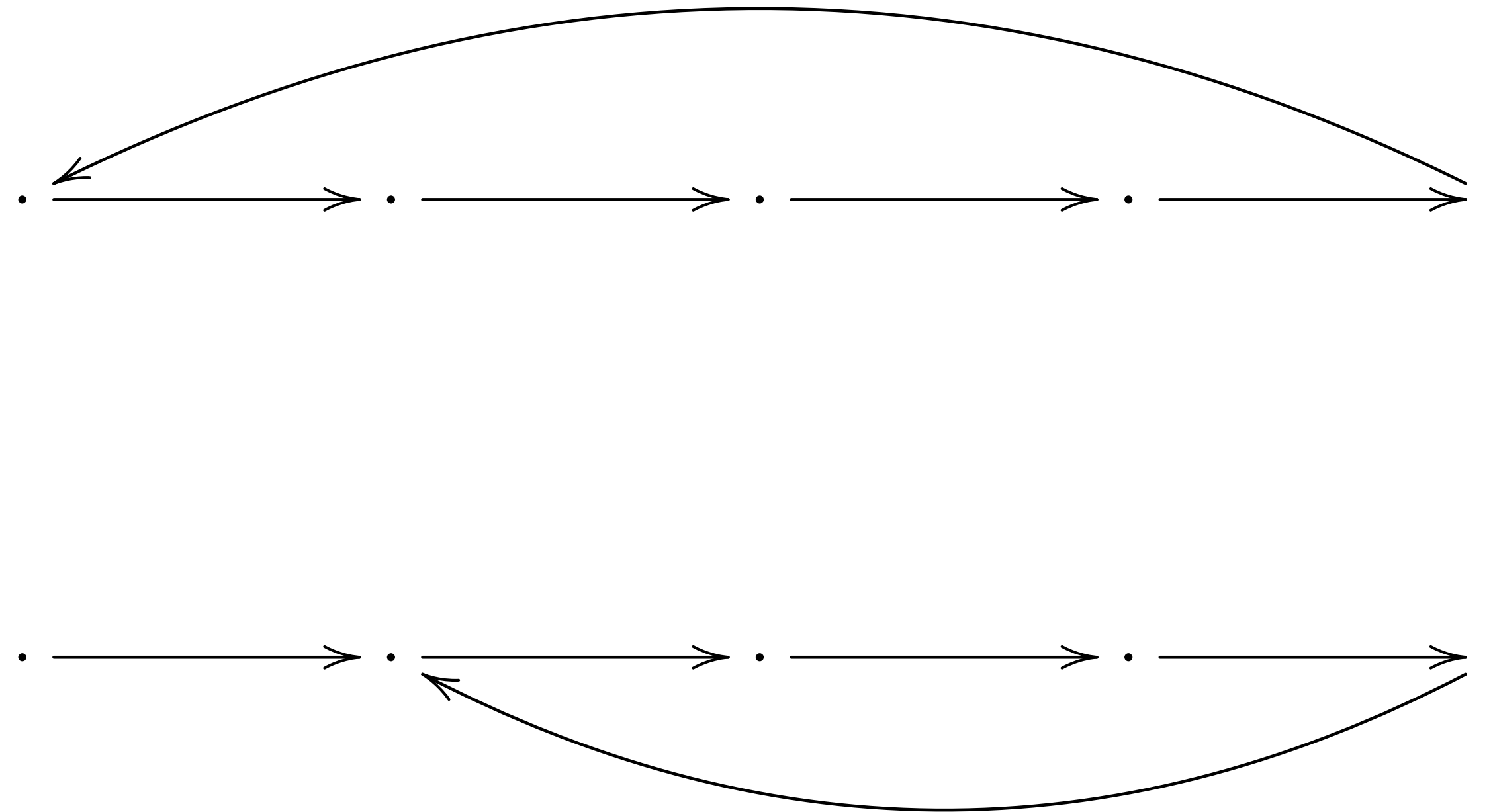
Correctness

- ▶ A relation R is a **proof of equivalence** (bisimulation) if $x R y$ entails
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The previous algorithm attempts to construct a bisimulation

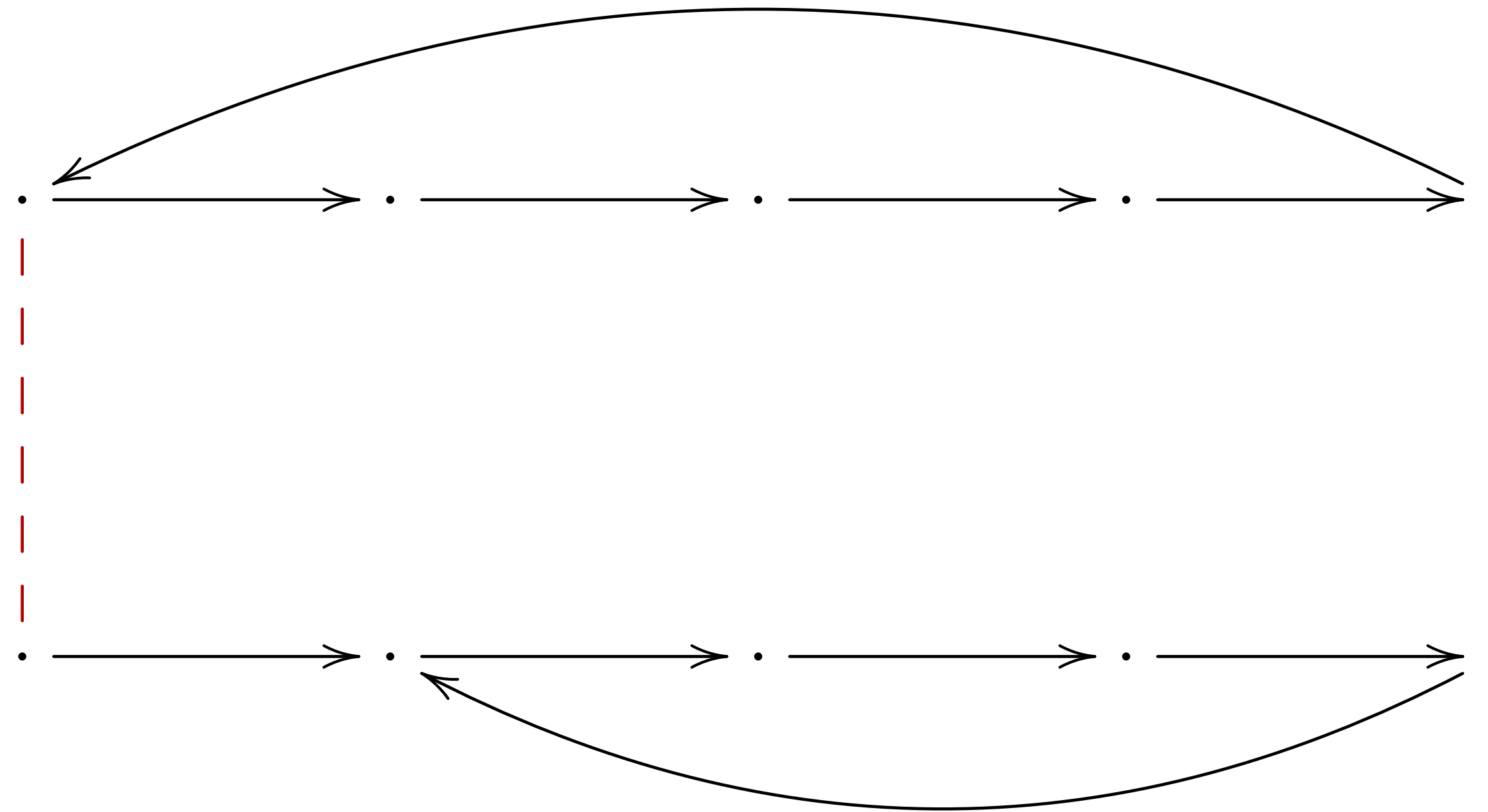
Complexity

The previous algorithm is **quadratic**



Complexity

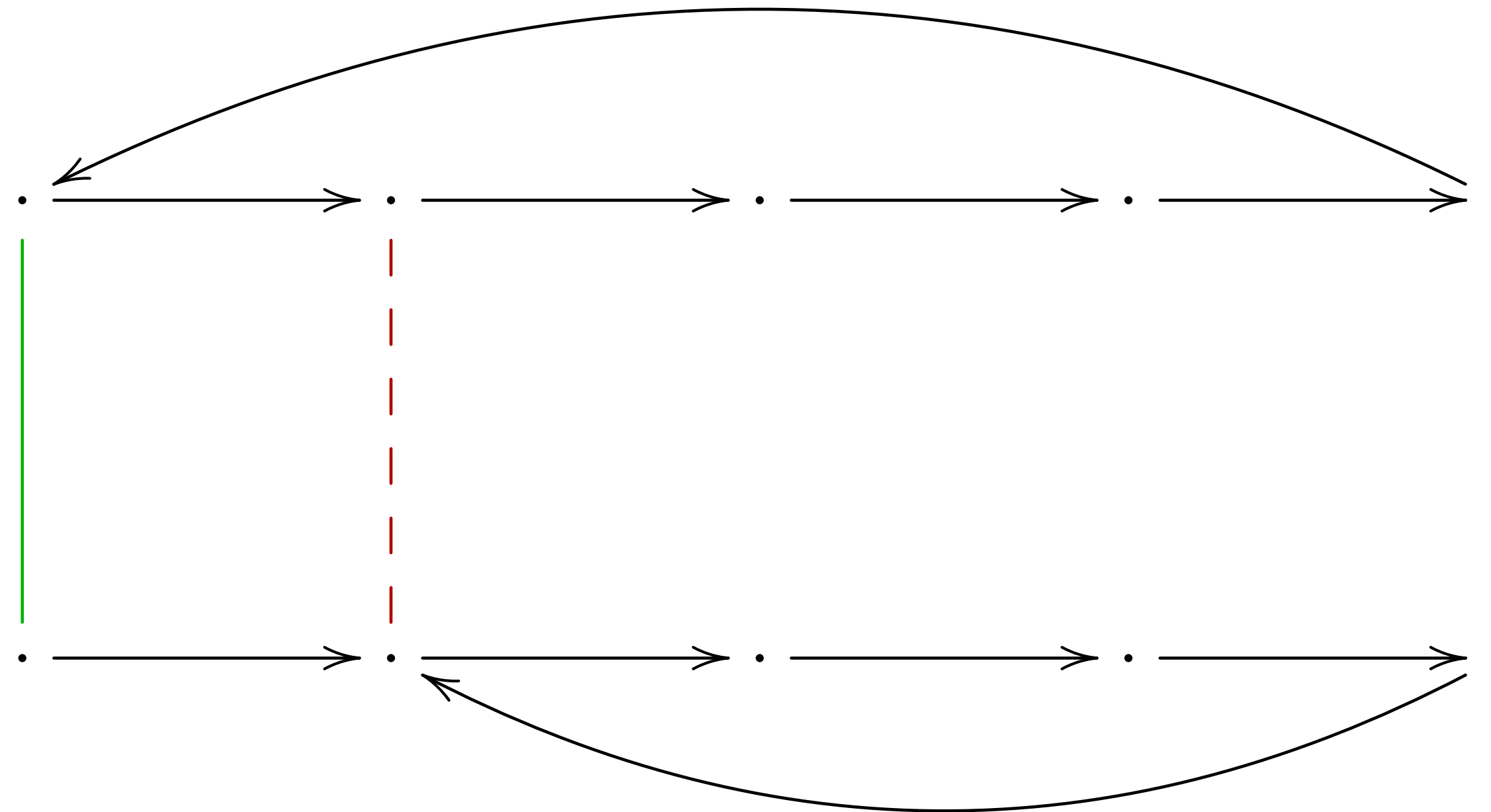
The previous algorithm is quadratic



0 pairs

Complexity

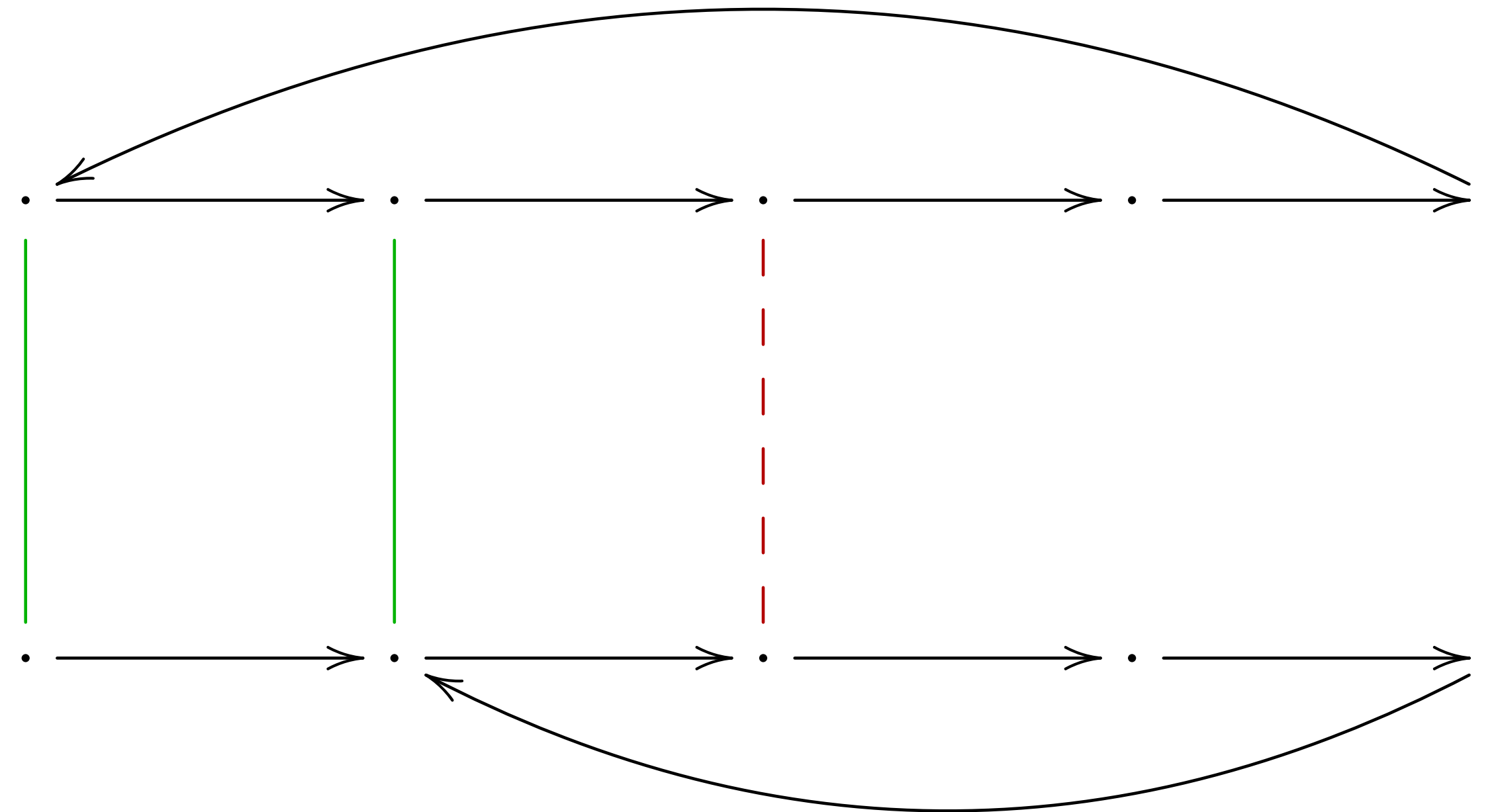
The previous algorithm is quadratic



1 pairs

Complexity

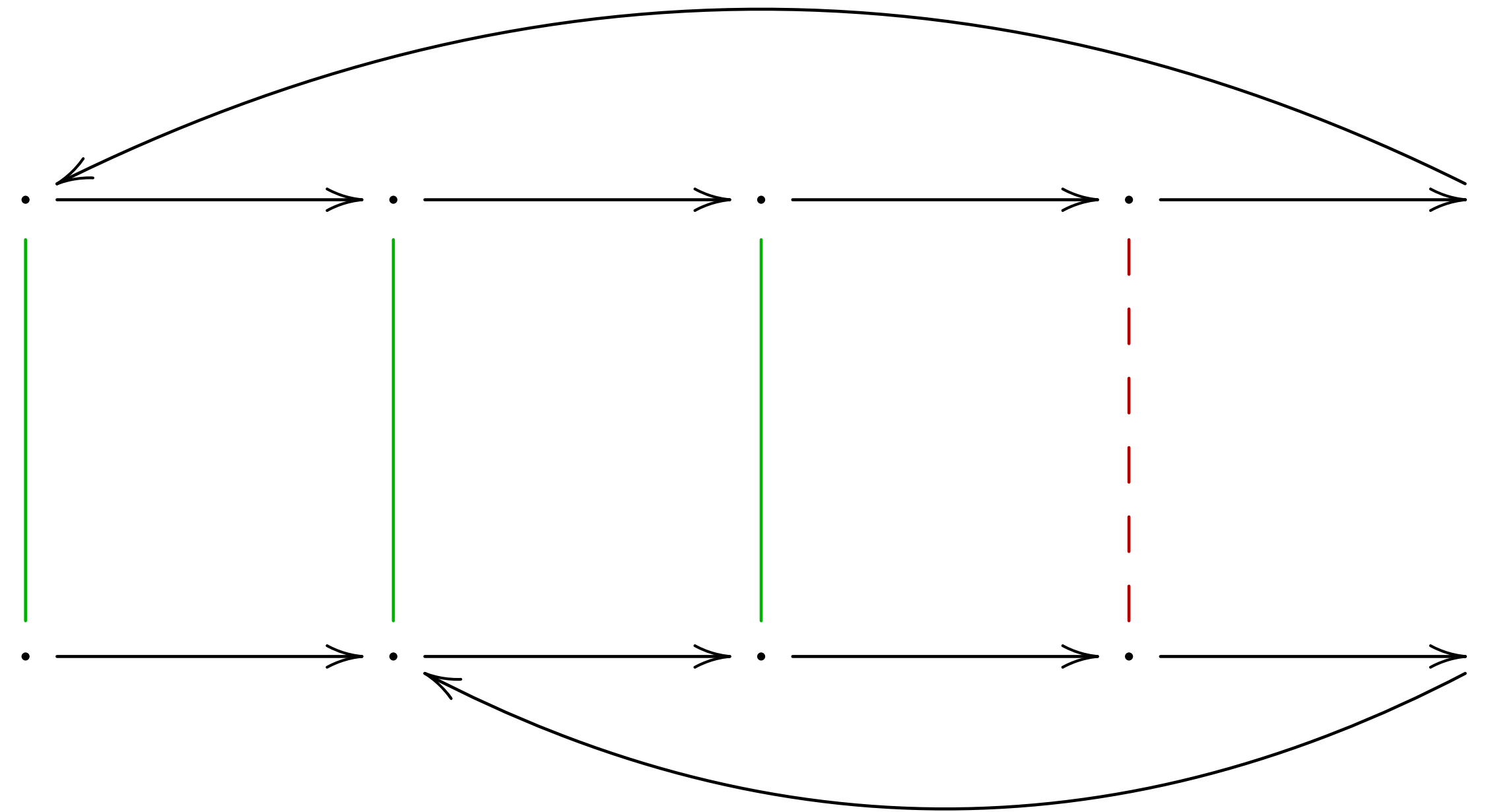
The previous algorithm is quadratic



2 pairs

Complexity

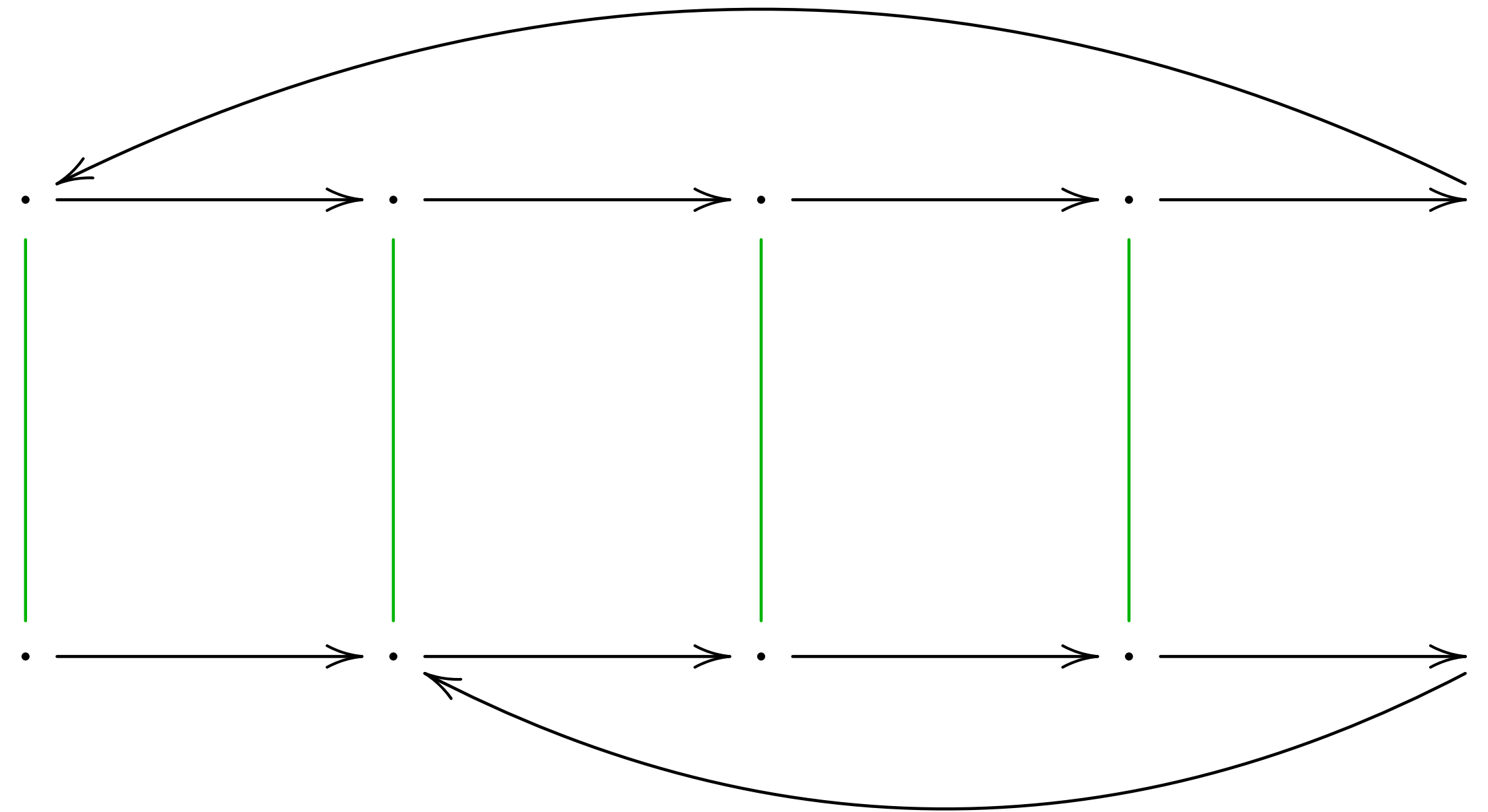
The previous algorithm is **quadratic**



3 pairs

Complexity

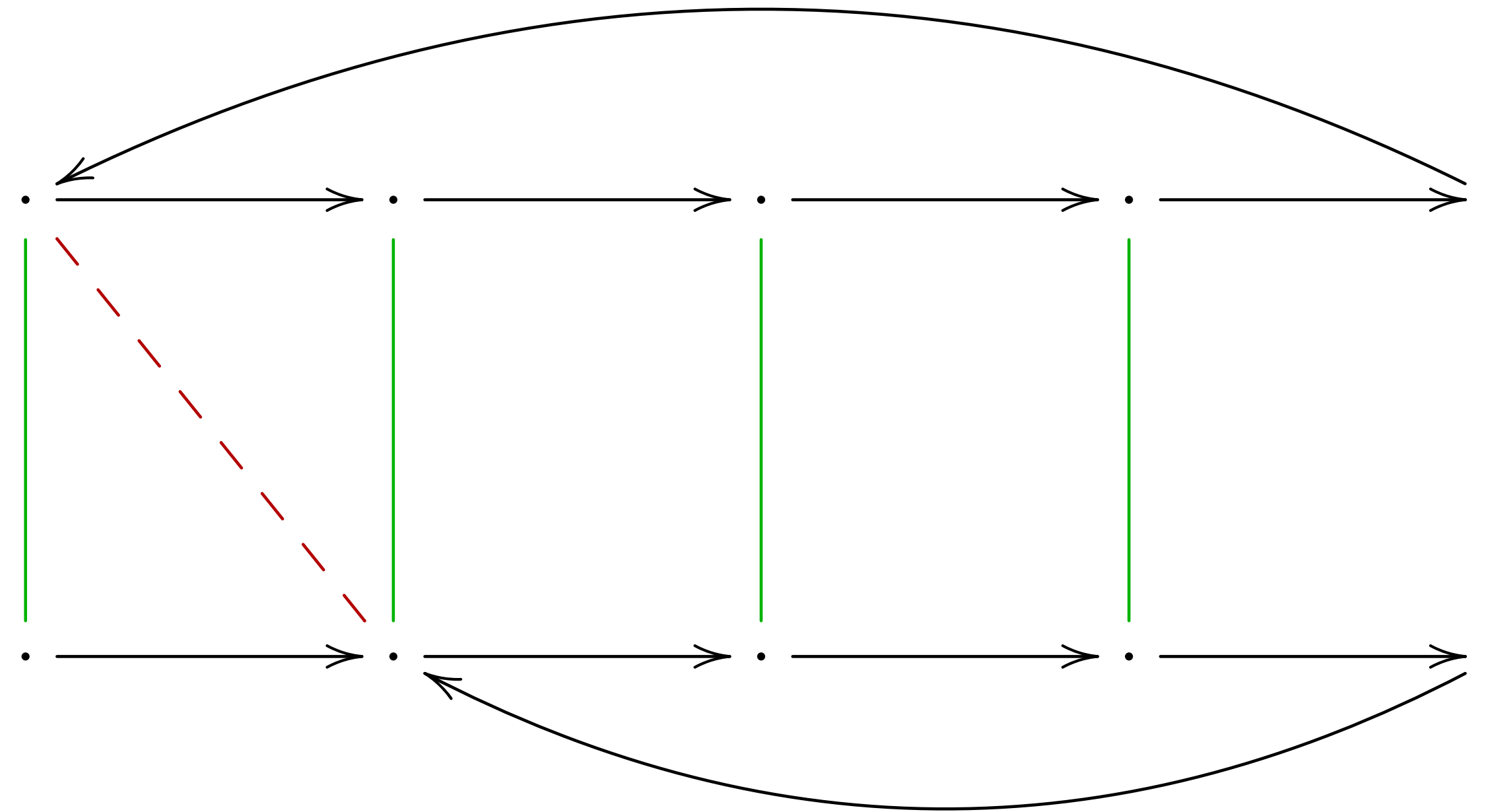
The previous algorithm is **quadratic**



4 pairs

Complexity

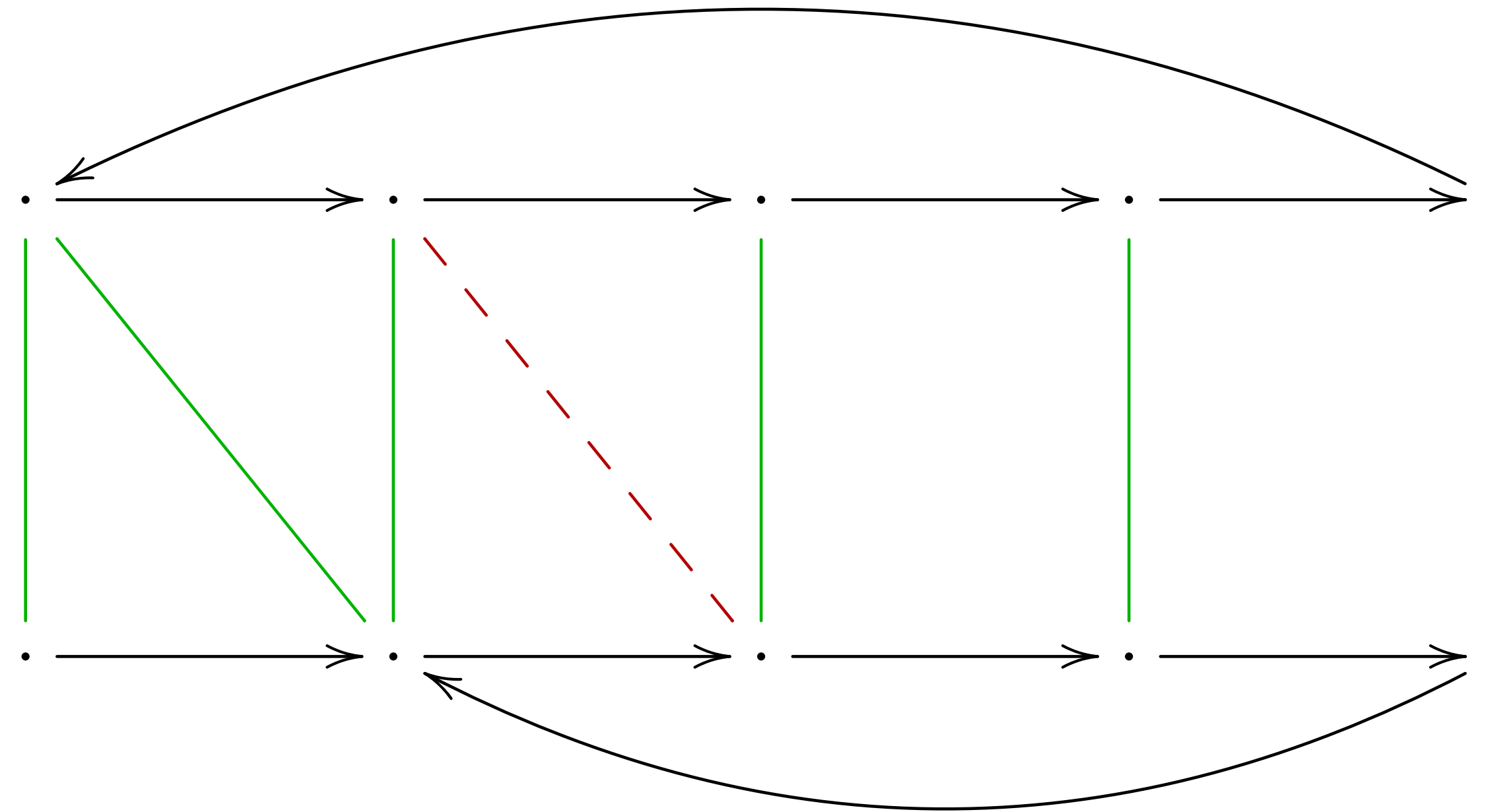
The previous algorithm is **quadratic**



5 pairs

Complexity

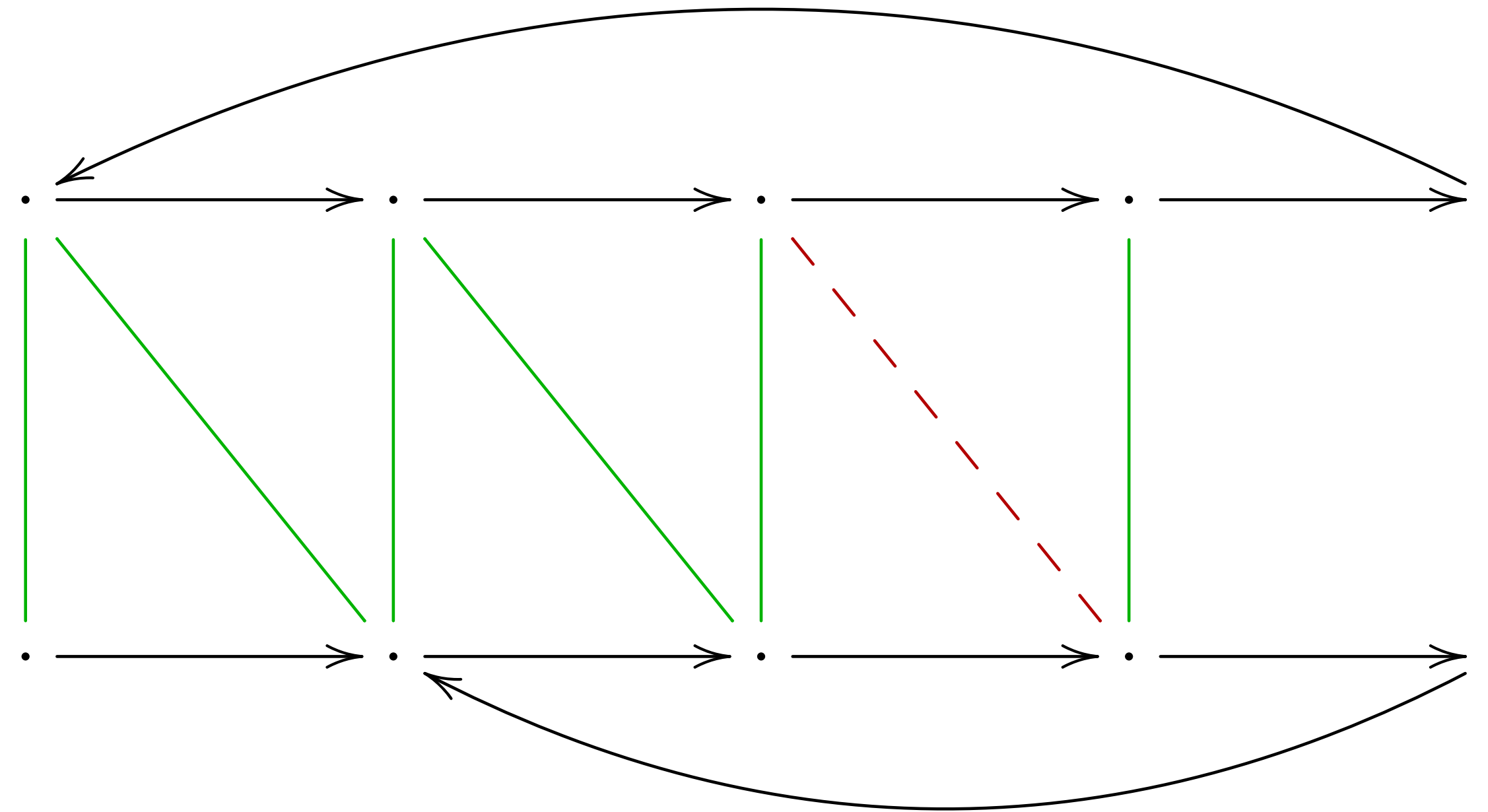
The previous algorithm is quadratic



6 pairs

Complexity

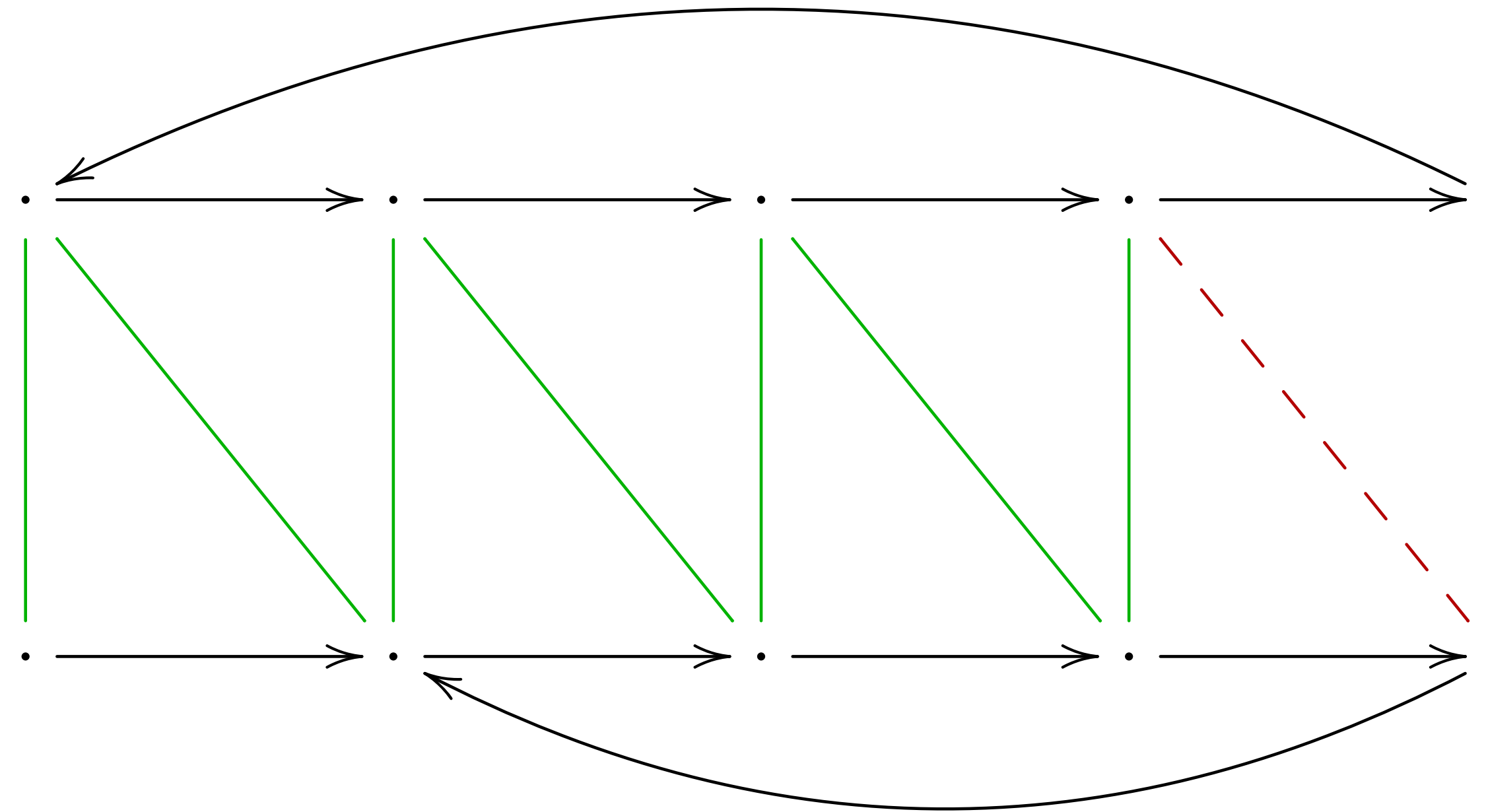
The previous algorithm is **quadratic**



7 pairs

Complexity

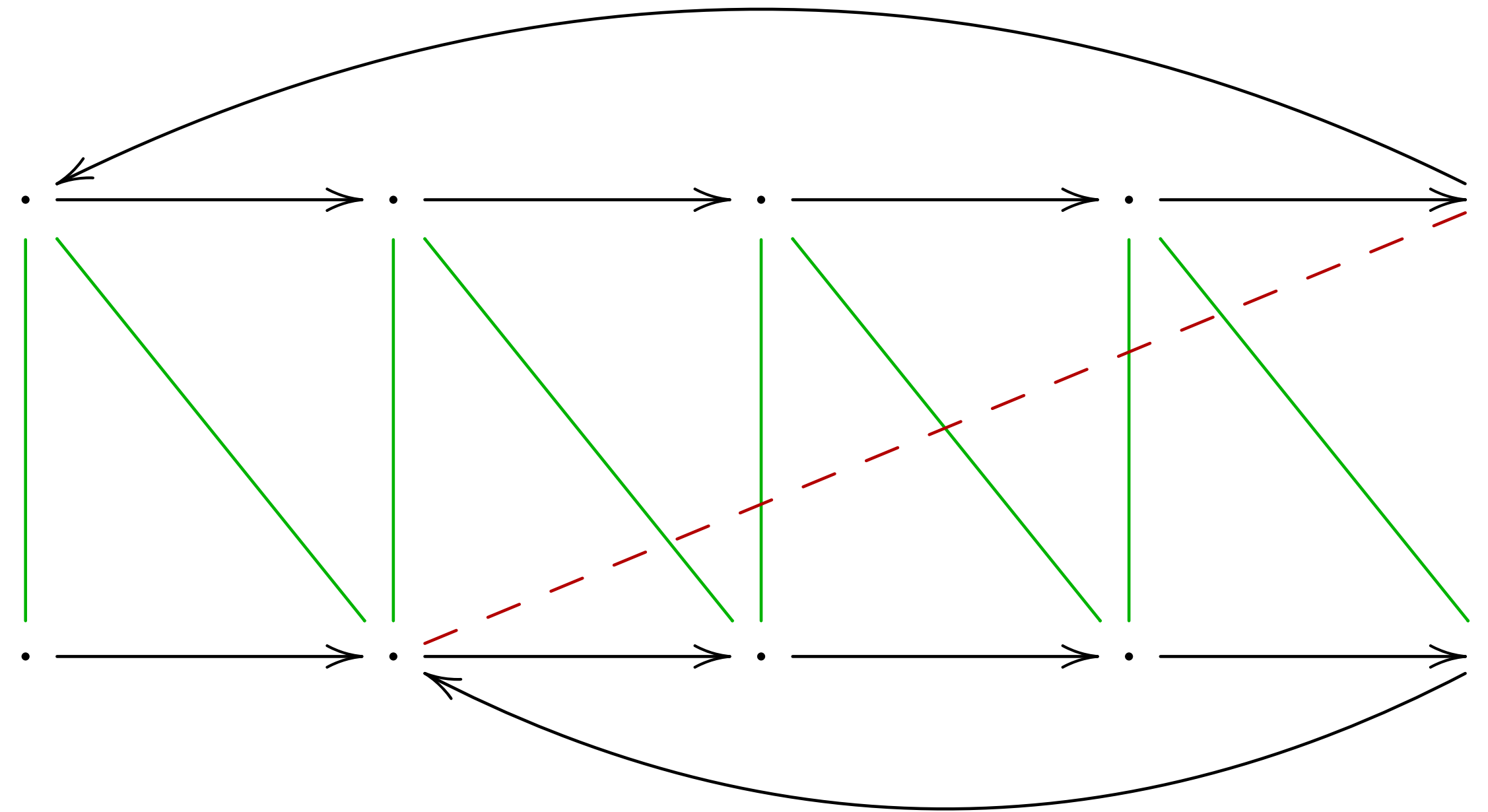
The previous algorithm is **quadratic**



8 pairs

Complexity

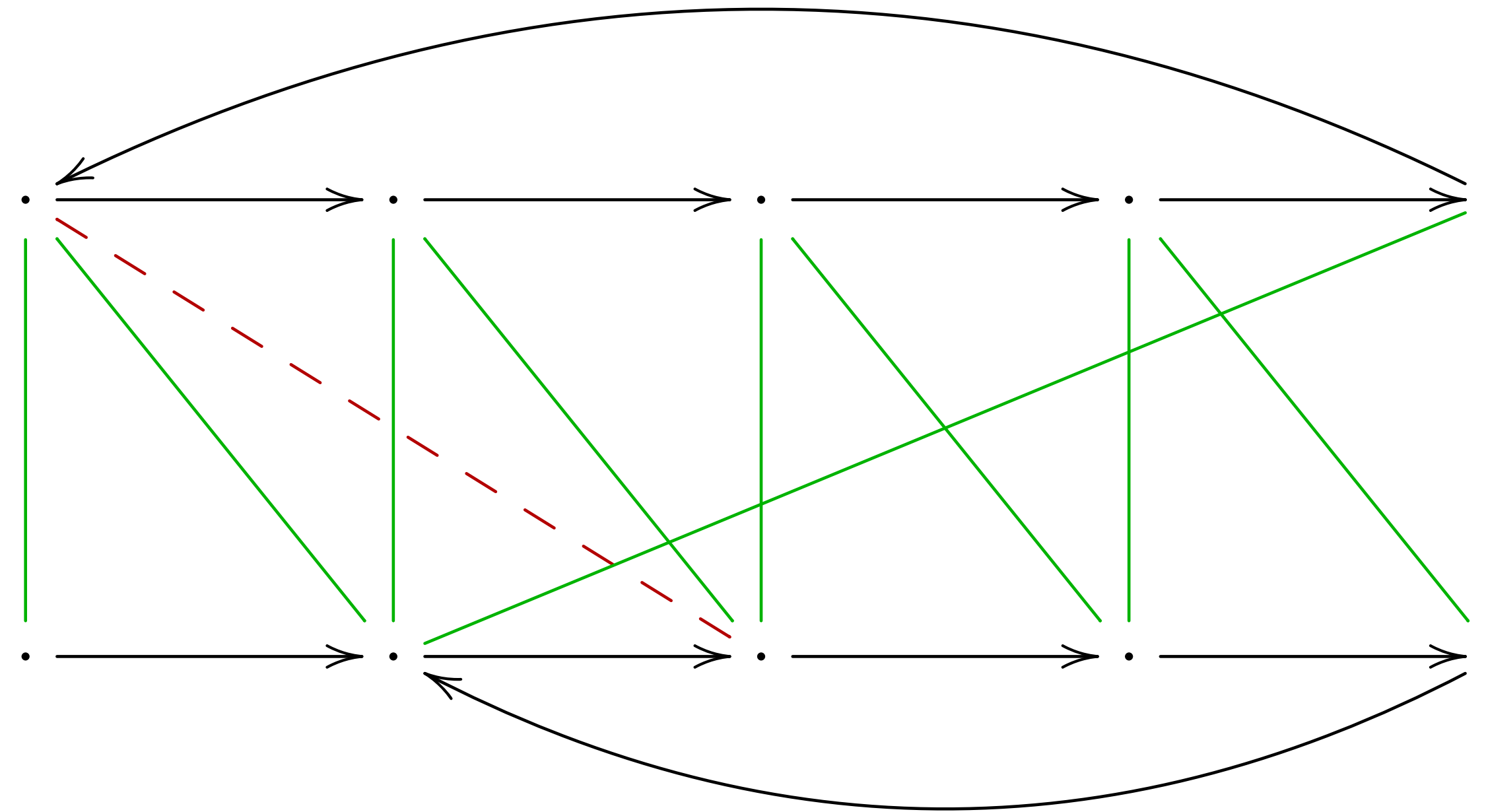
The previous algorithm is quadratic



9 pairs

Complexity

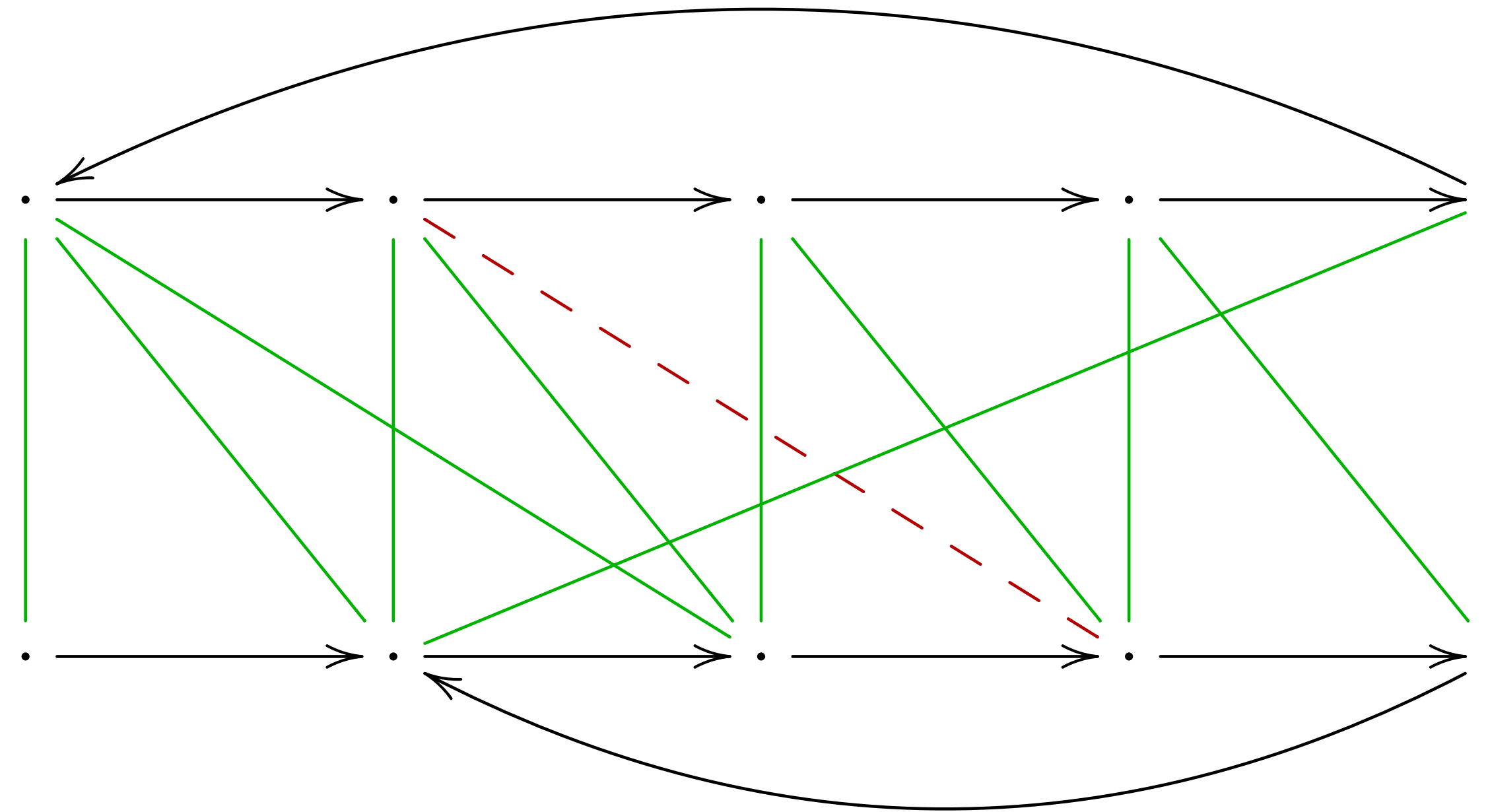
The previous algorithm is **quadratic**



10 pairs

Complexity

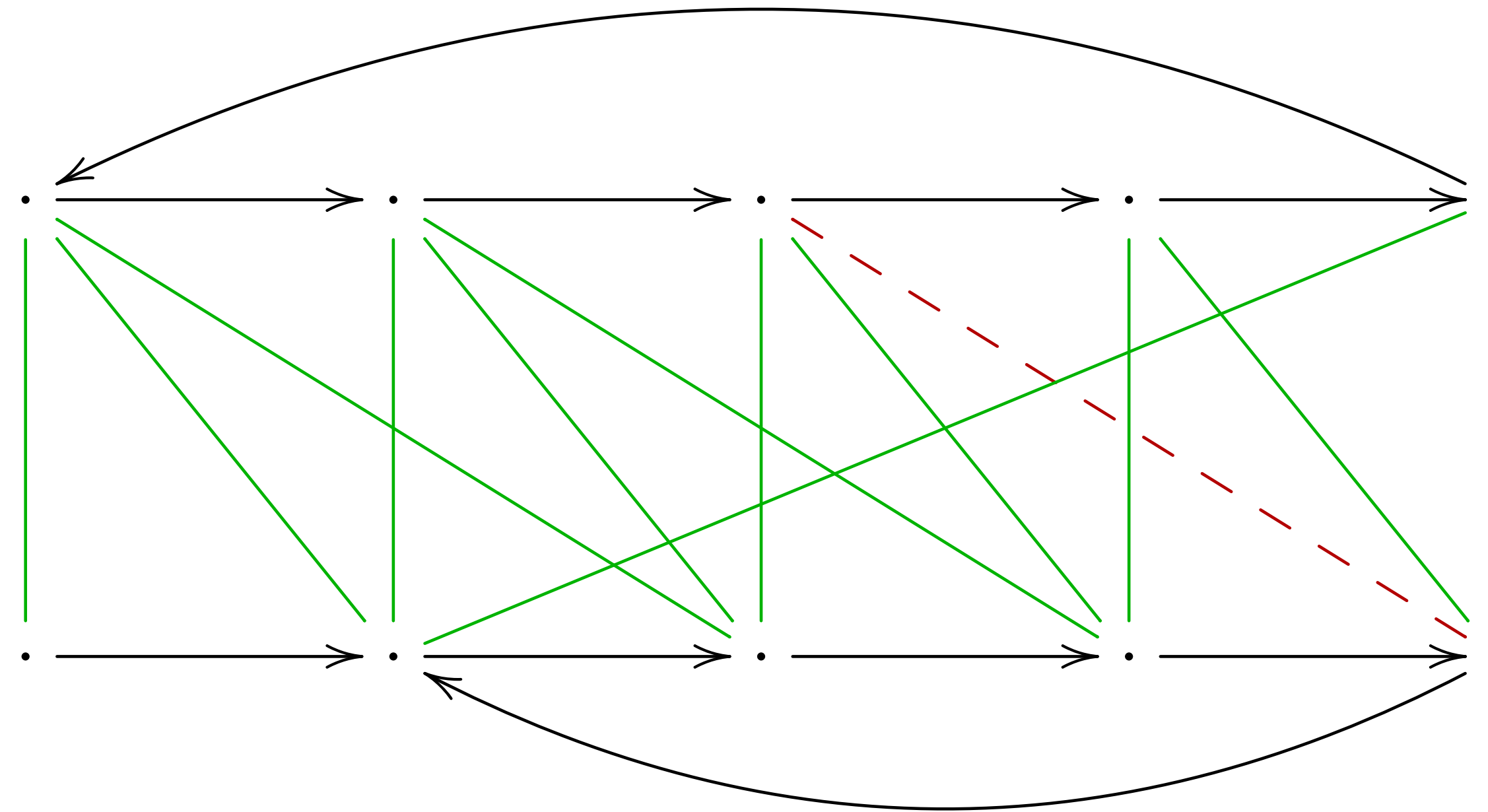
The previous algorithm is quadratic



11 pairs

Complexity

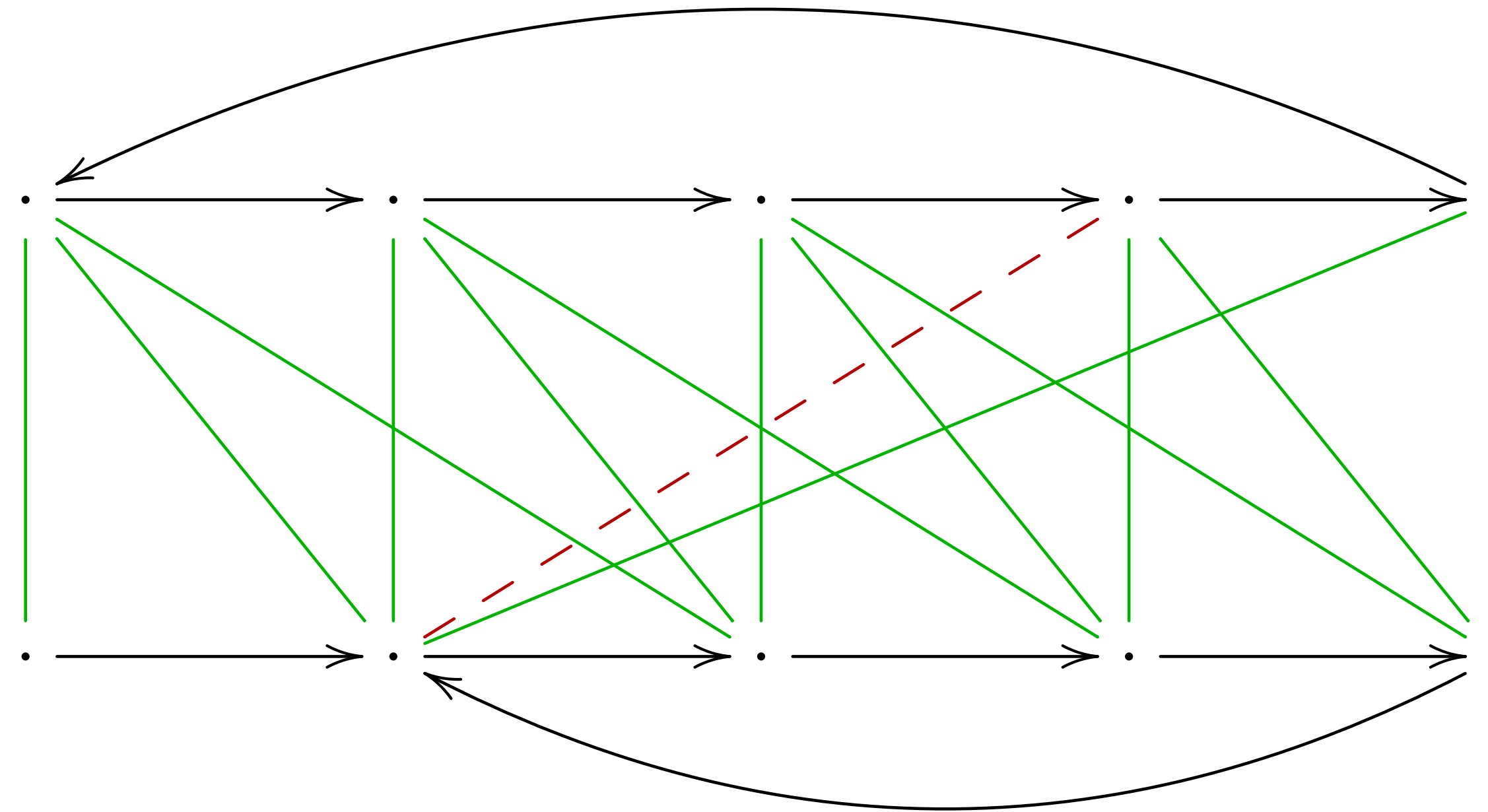
The previous algorithm is **quadratic**



12 pairs

Complexity

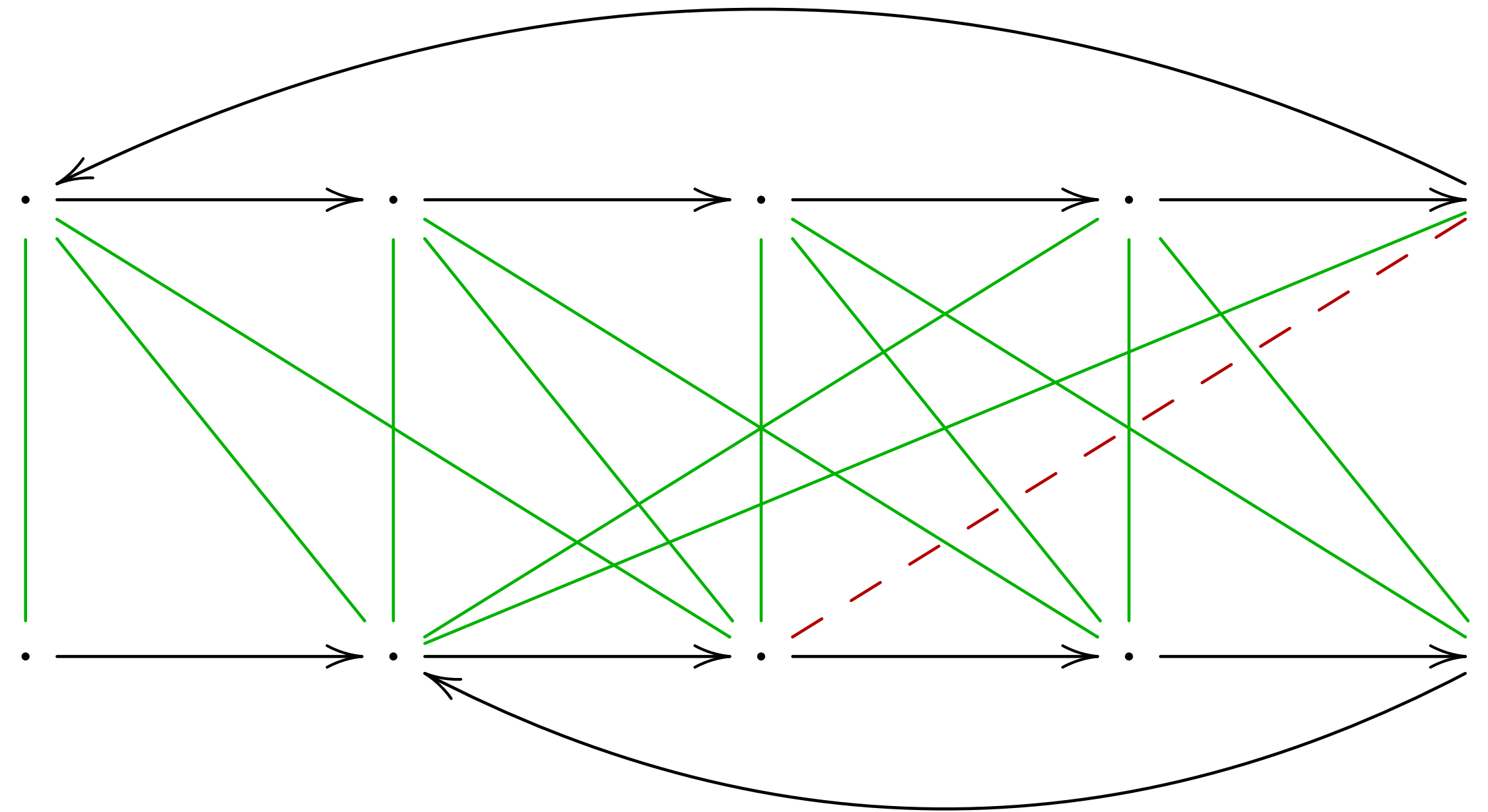
The previous algorithm is **quadratic**



13 pairs

Complexity

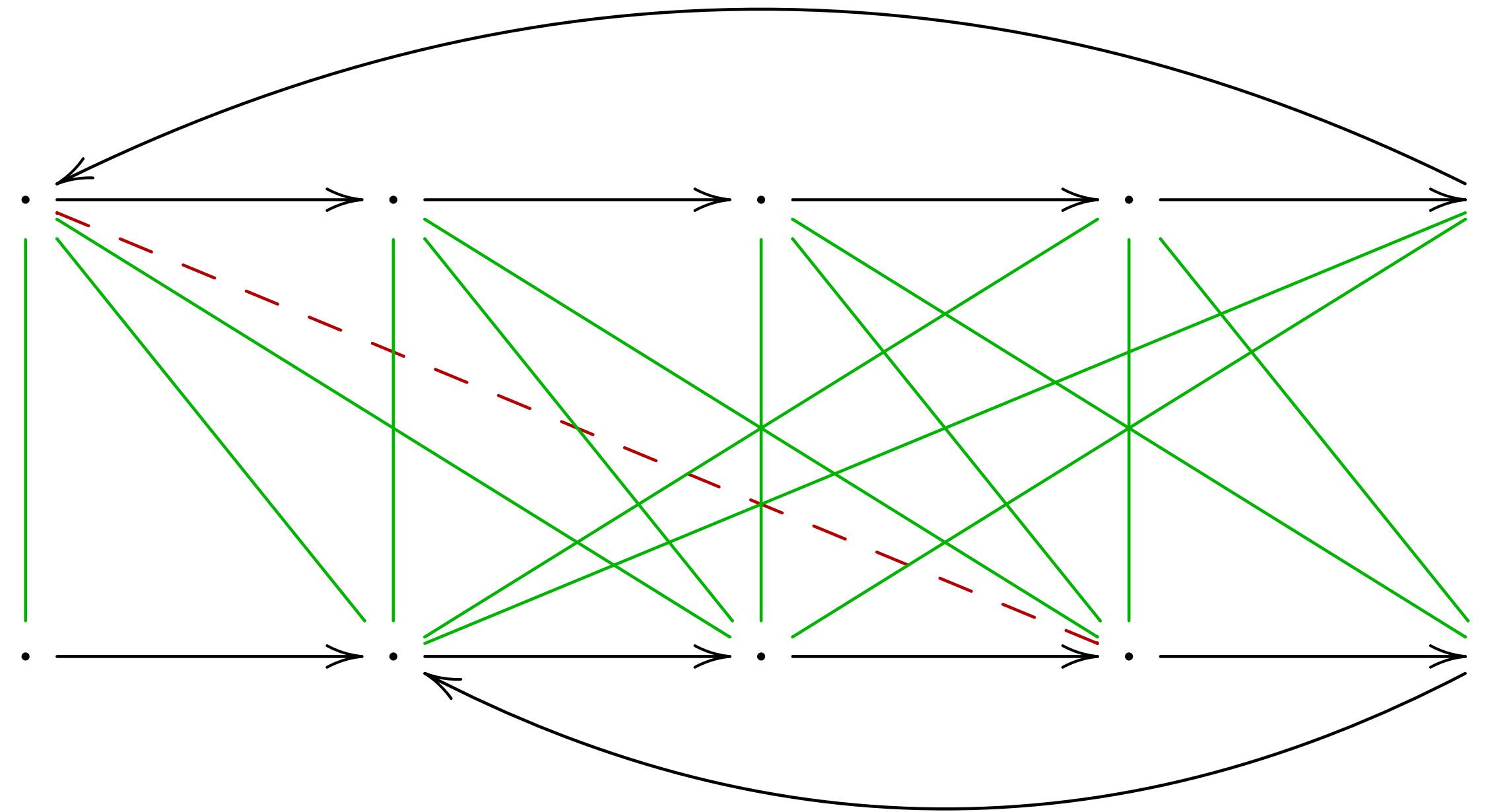
The previous algorithm is **quadratic**



14 pairs

Complexity

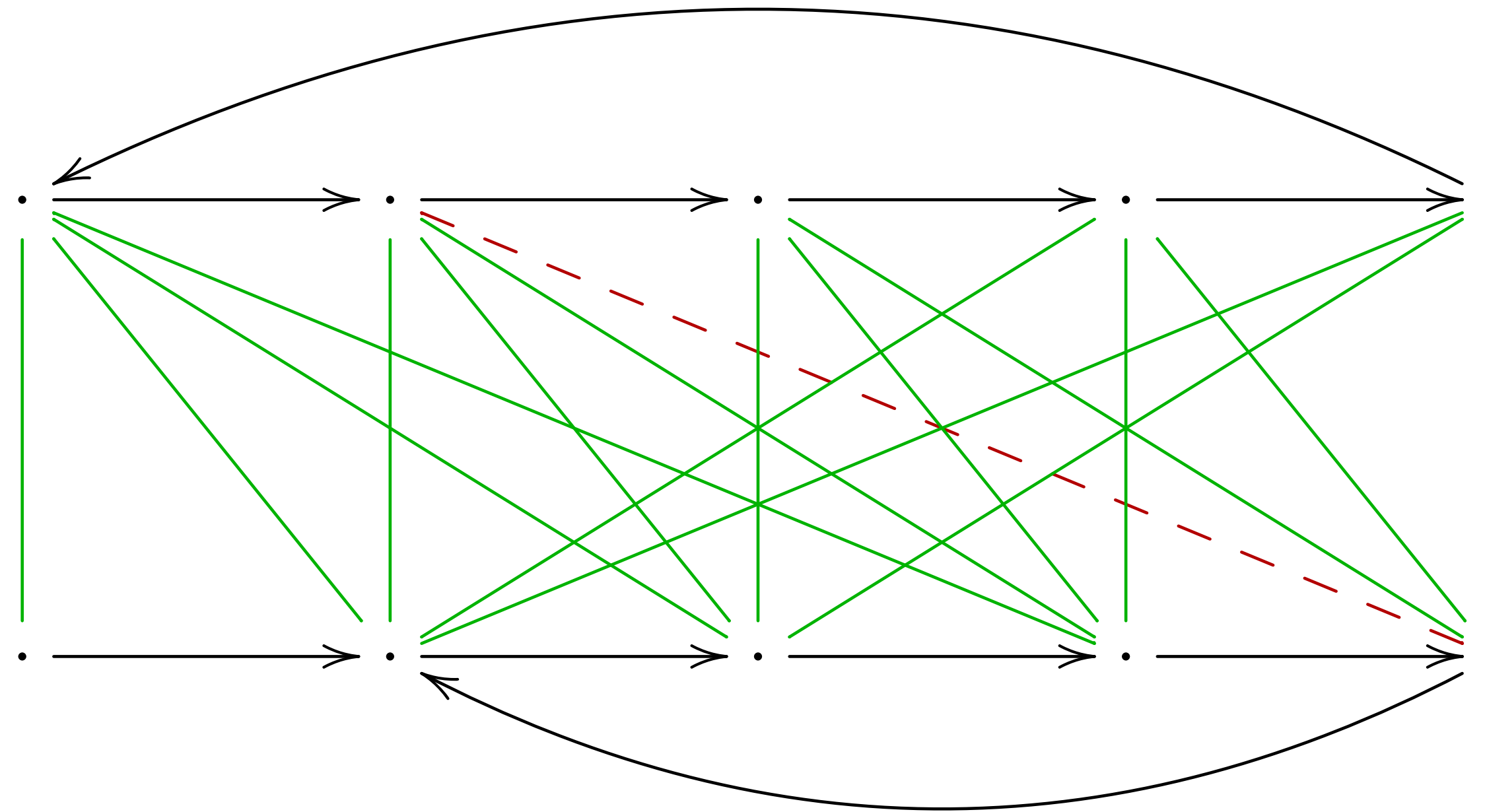
The previous algorithm is **quadratic**



15 pairs

Complexity

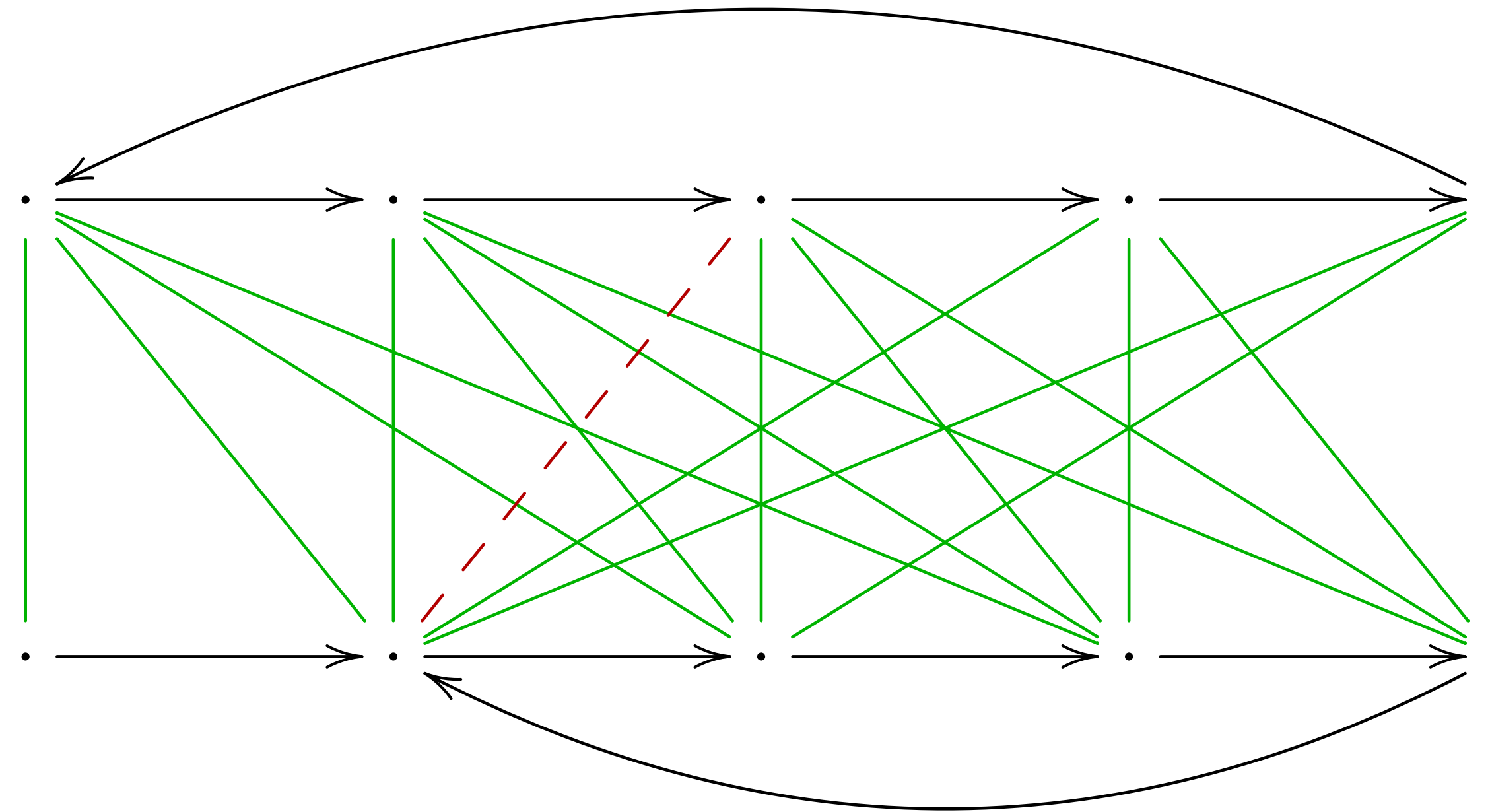
The previous algorithm is **quadratic**



16 pairs

Complexity

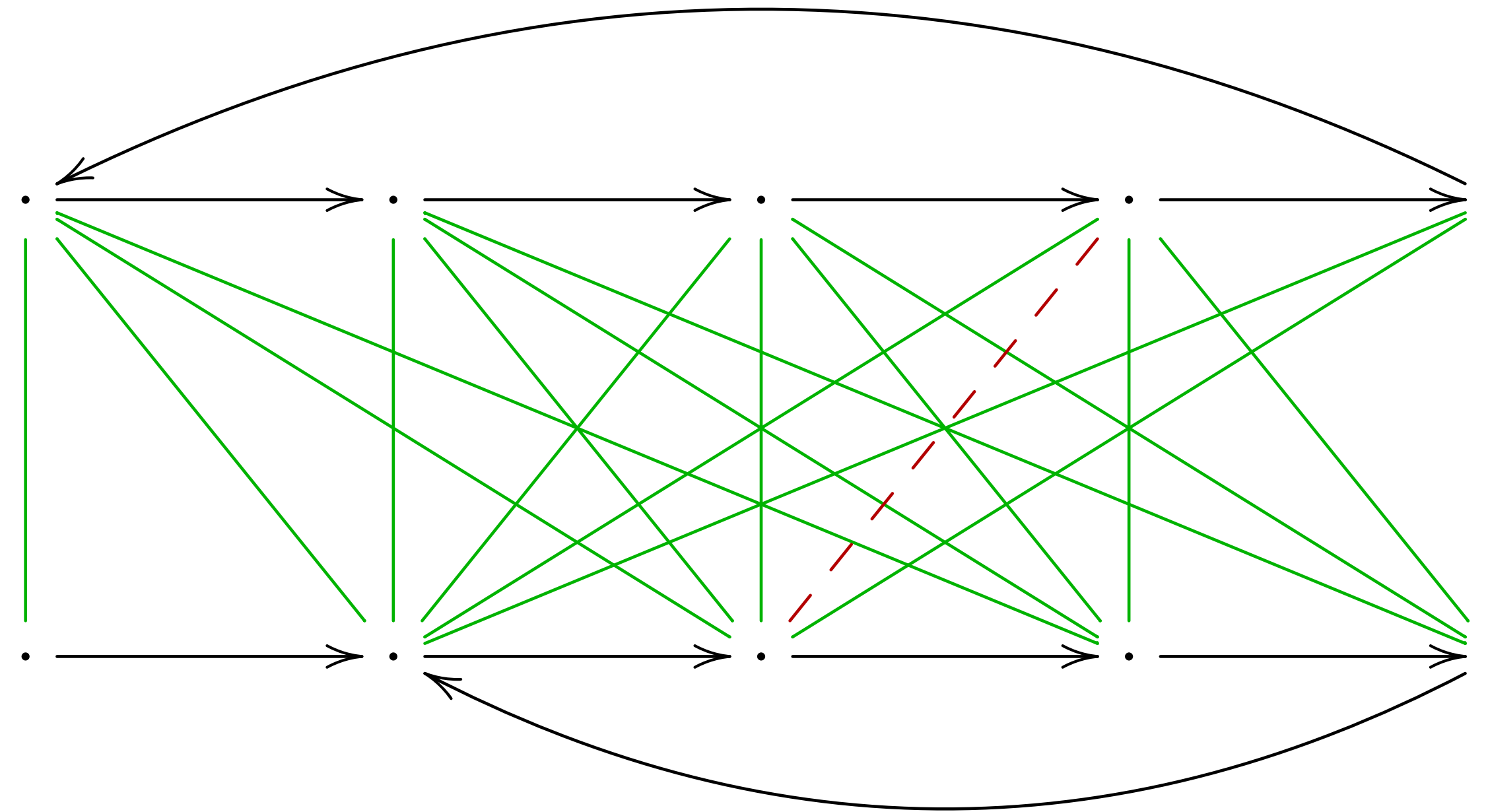
The previous algorithm is **quadratic**



17 pairs

Complexity

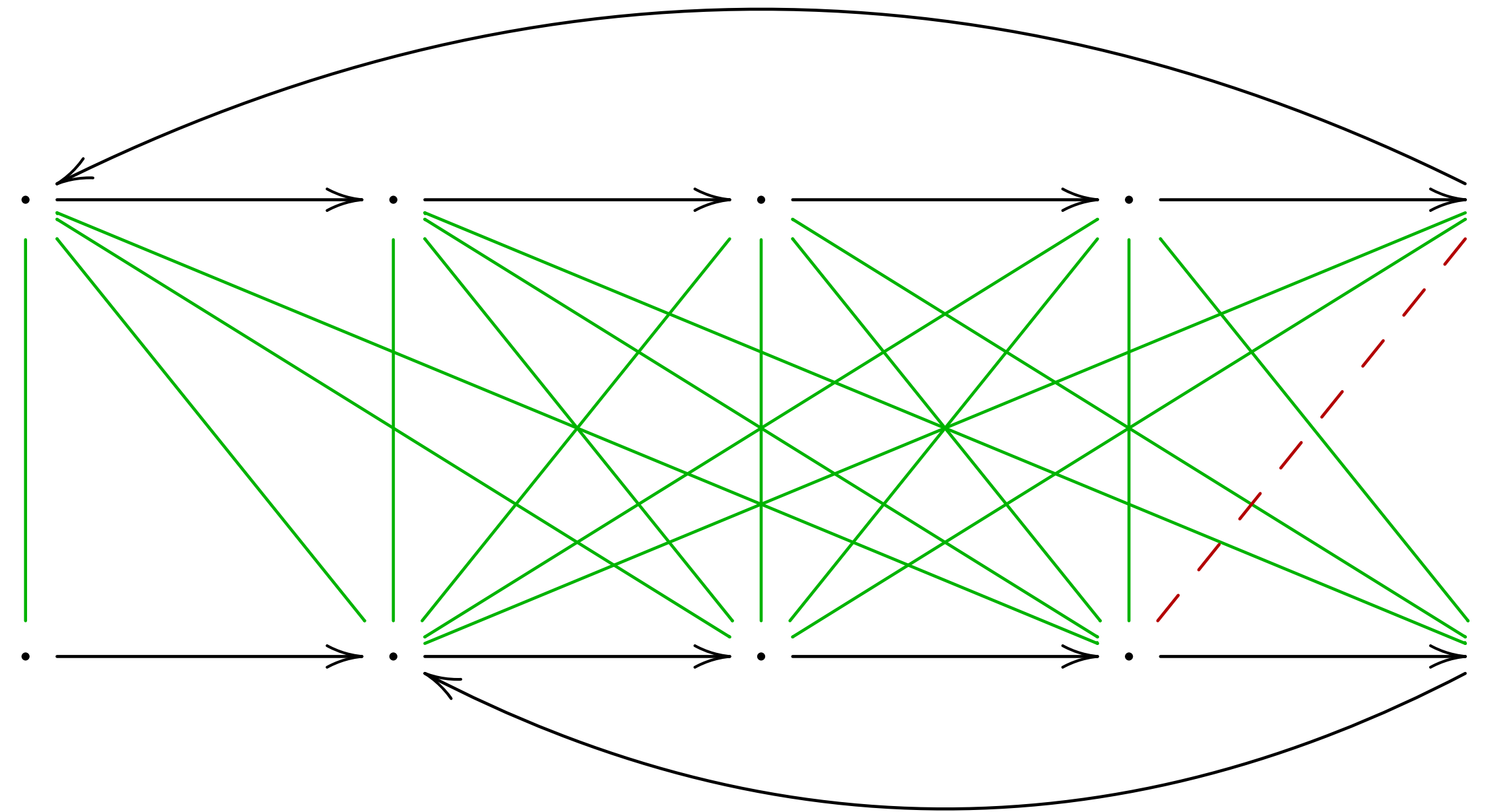
The previous algorithm is **quadratic**



18 pairs

Complexity

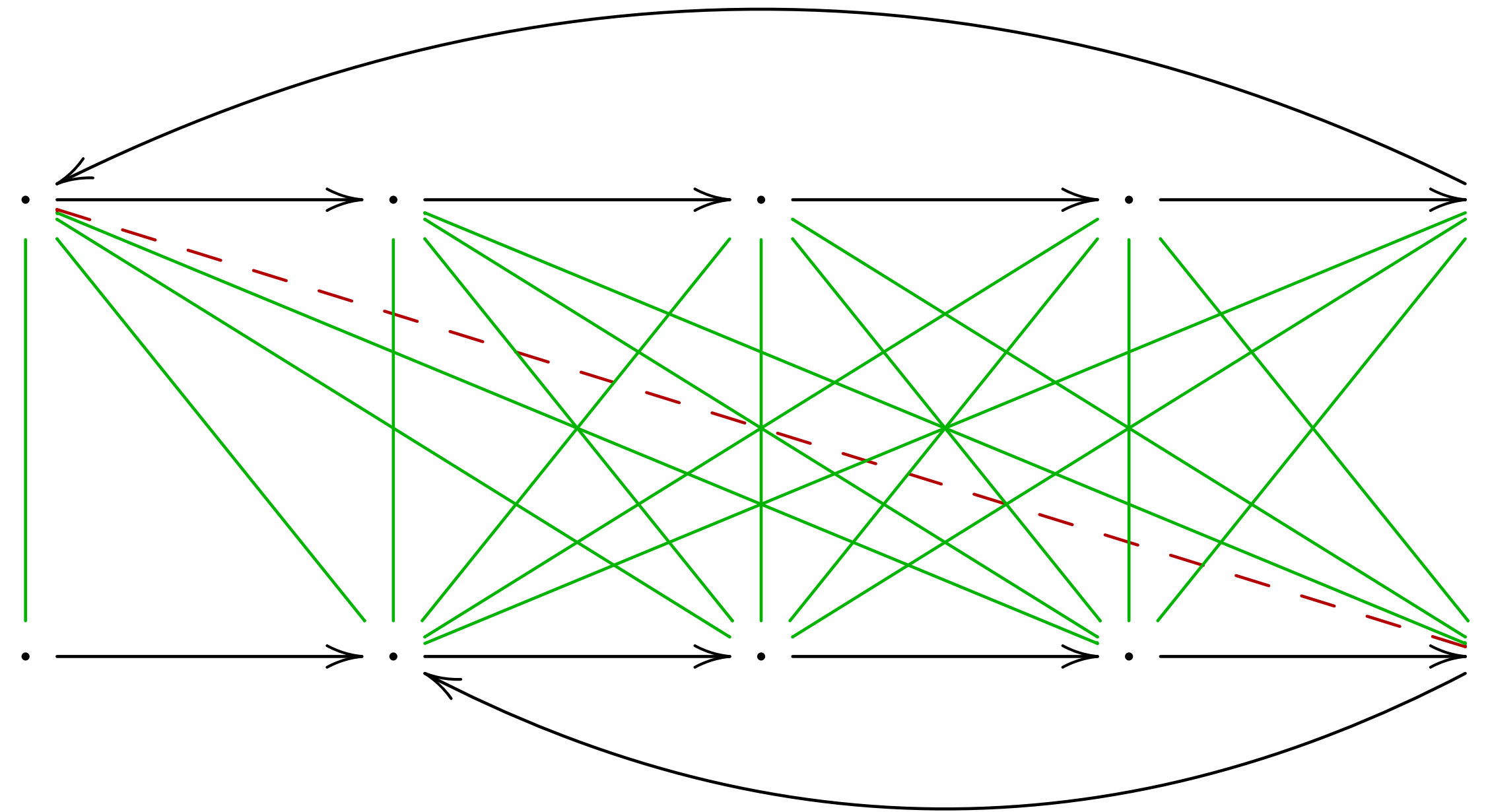
The previous algorithm is **quadratic**



19 pairs

Complexity

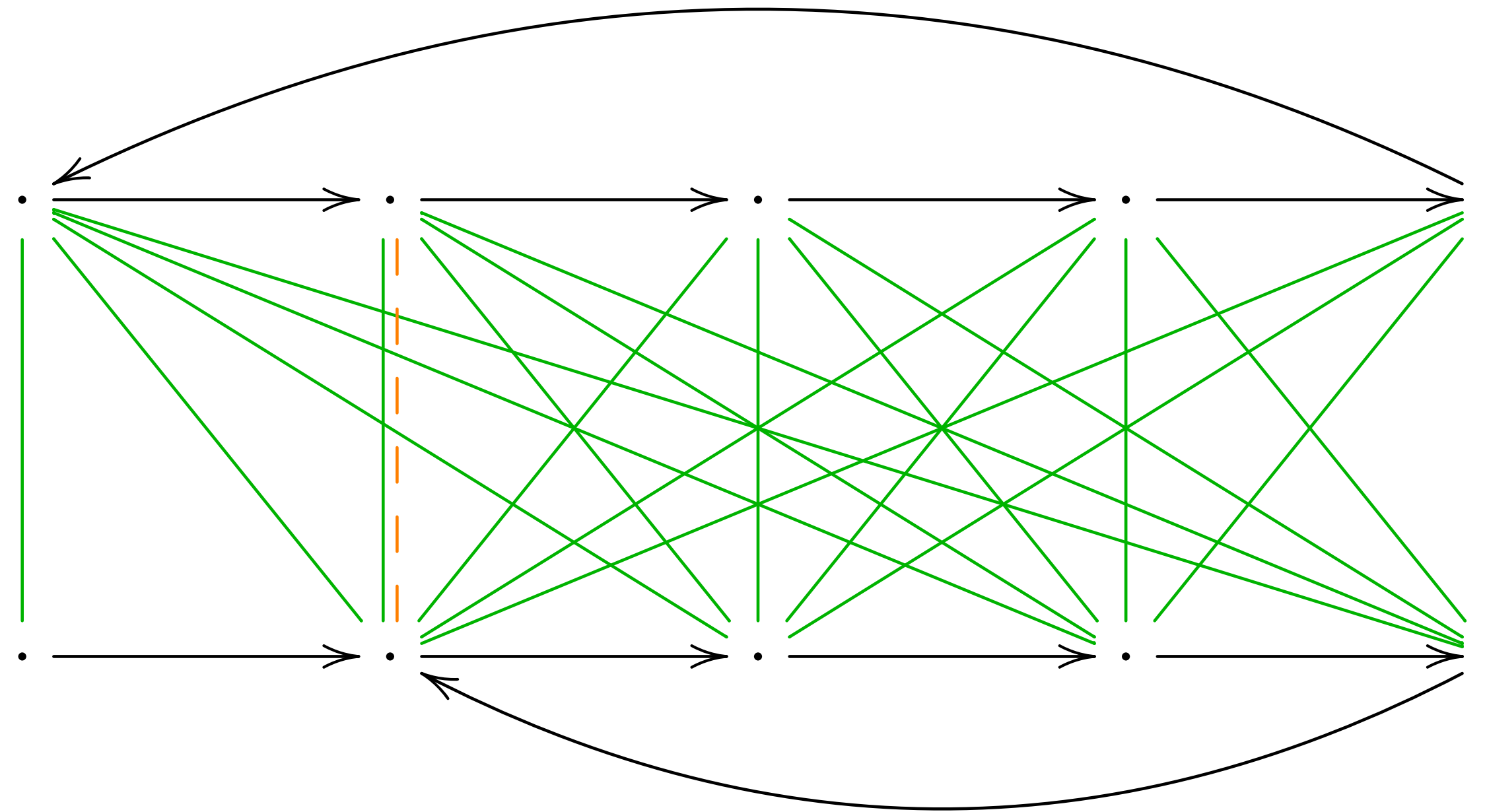
The previous algorithm is **quadratic**



20 pairs

Complexity

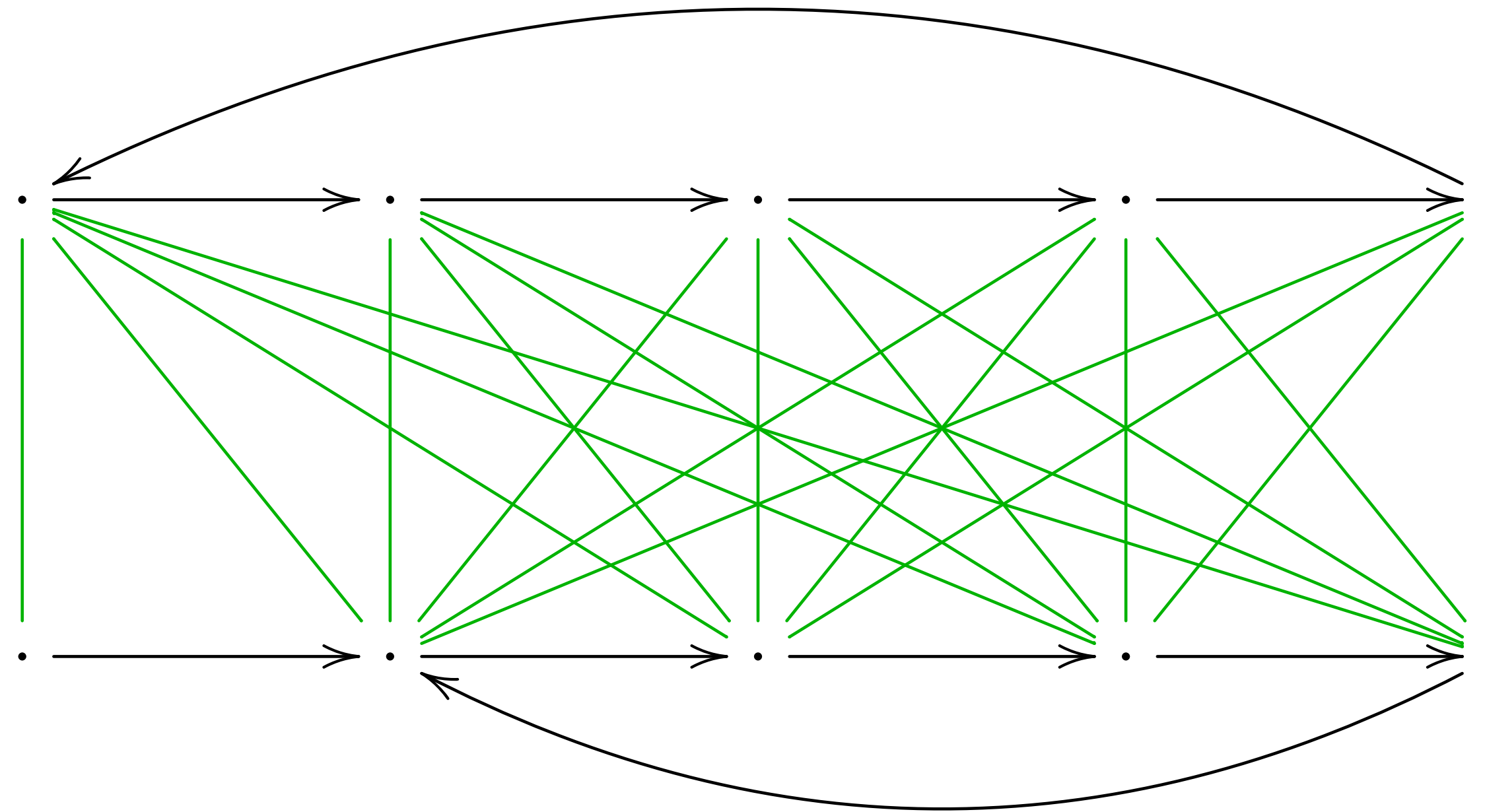
The previous algorithm is **quadratic**



21 pairs

Complexity

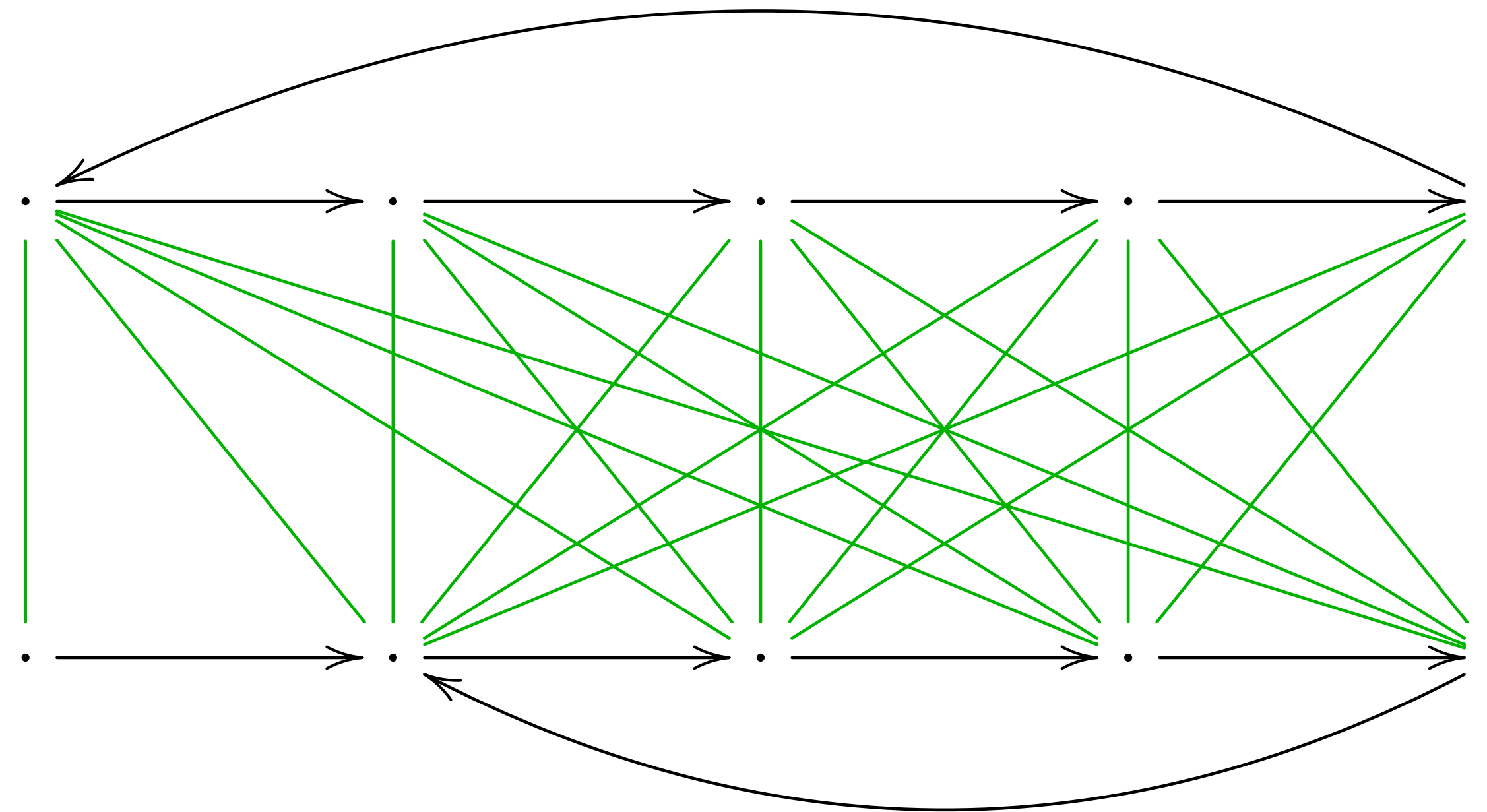
The previous algorithm is **quadratic**



21 pairs

First improvement

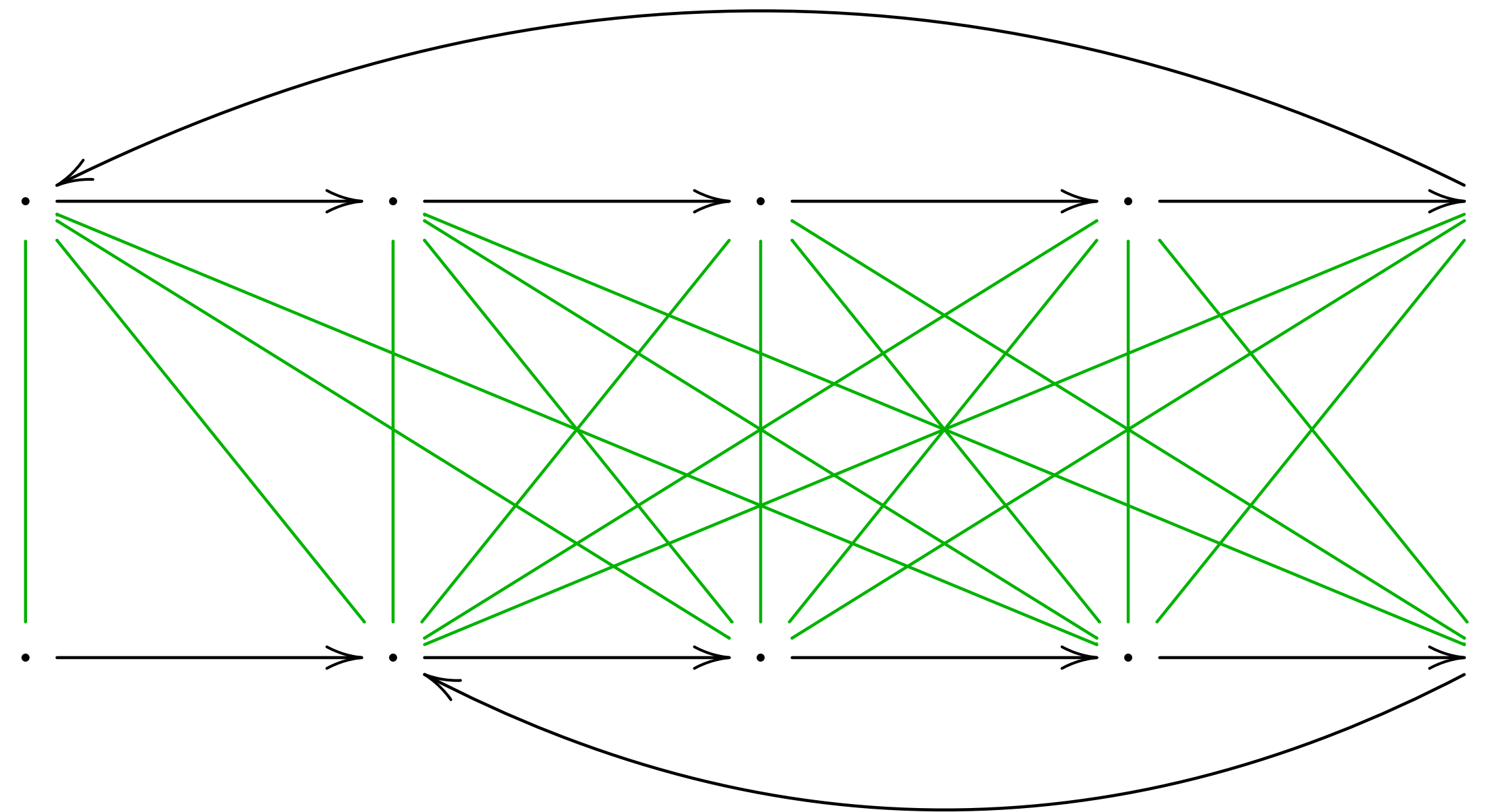
One can stop much earlier



21 pairs

First improvement

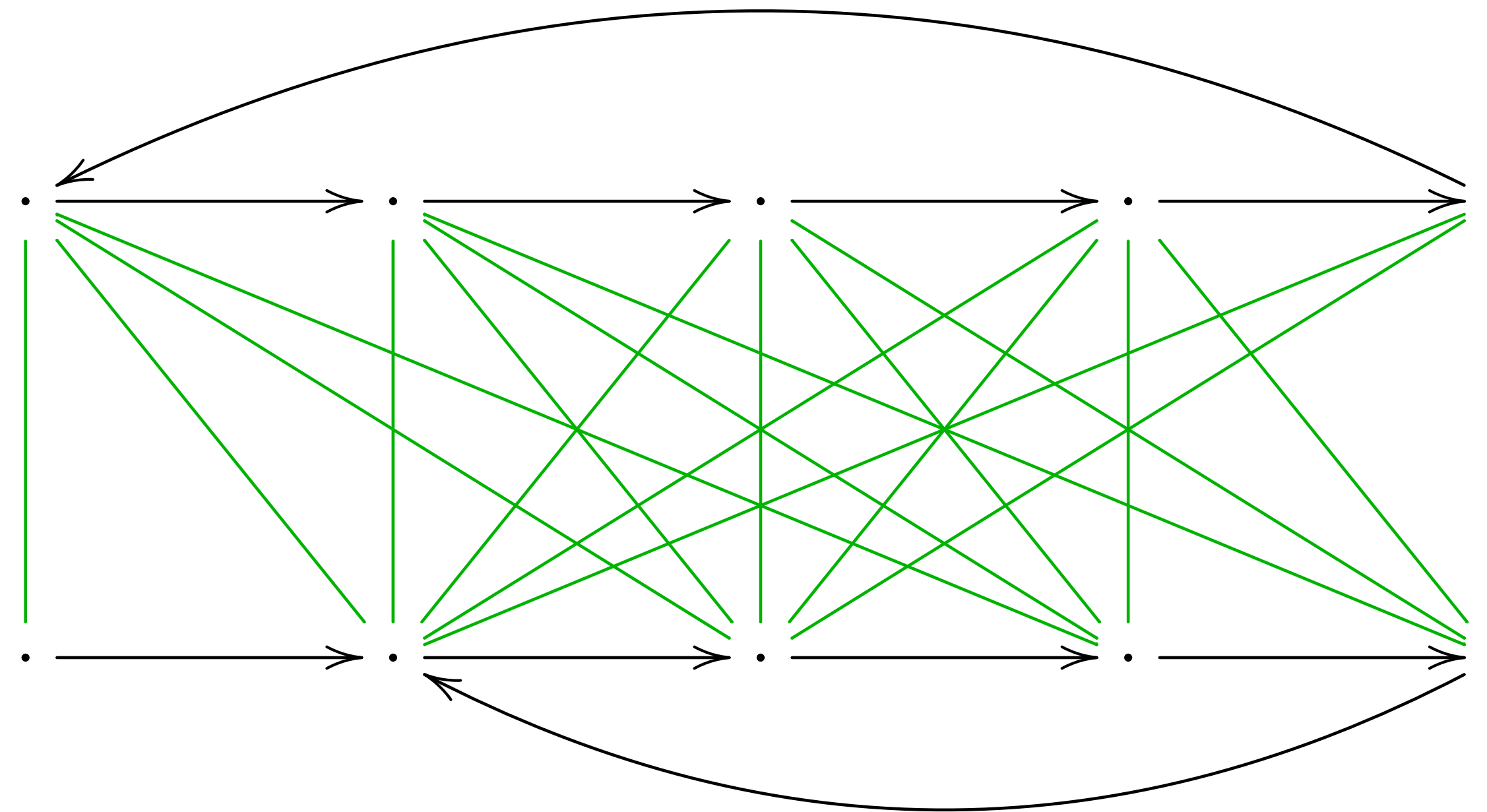
One can stop much earlier



~~21~~ 20 pairs

First improvement

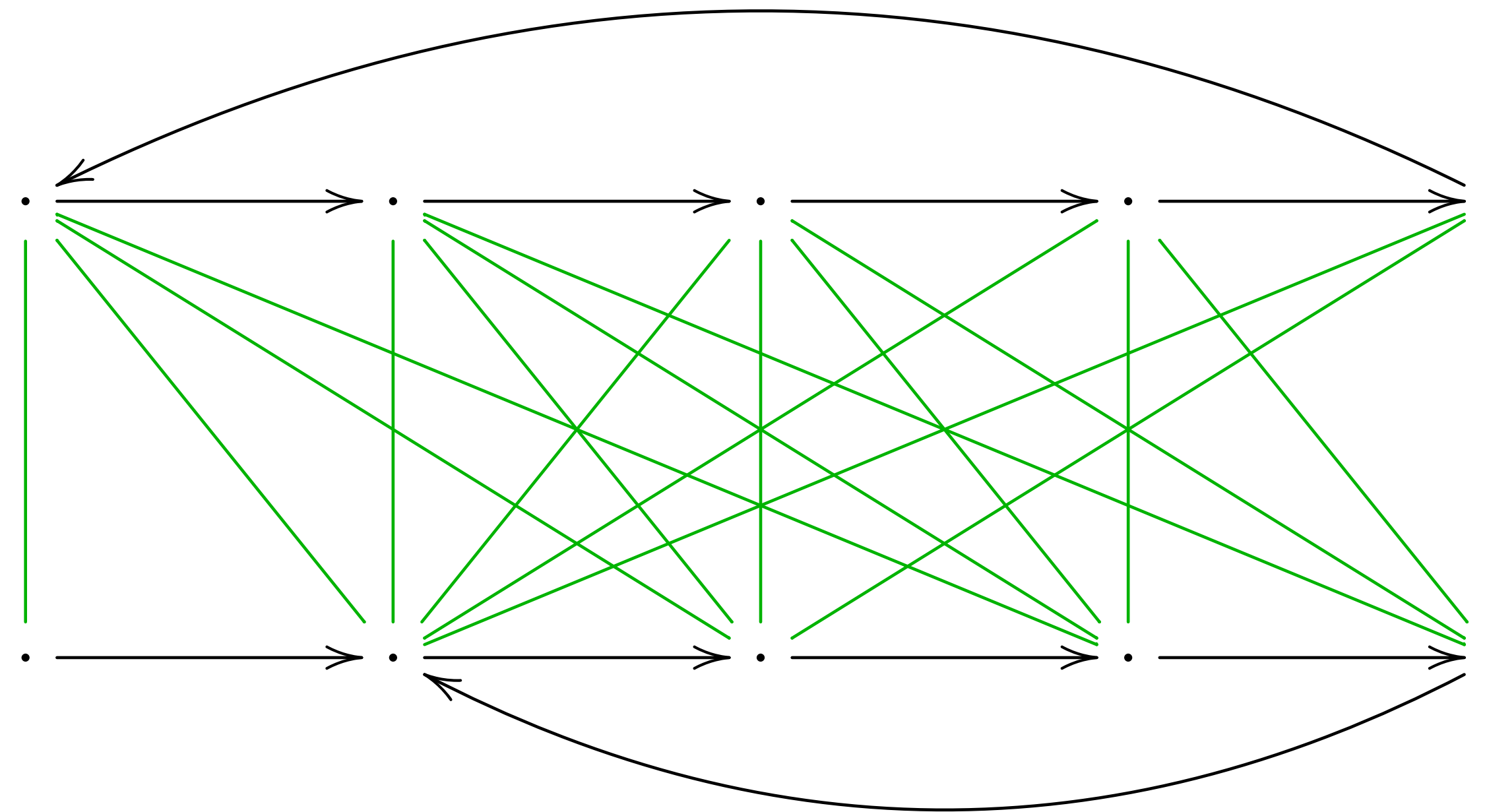
One can stop much earlier



~~21~~ 19 pairs

First improvement

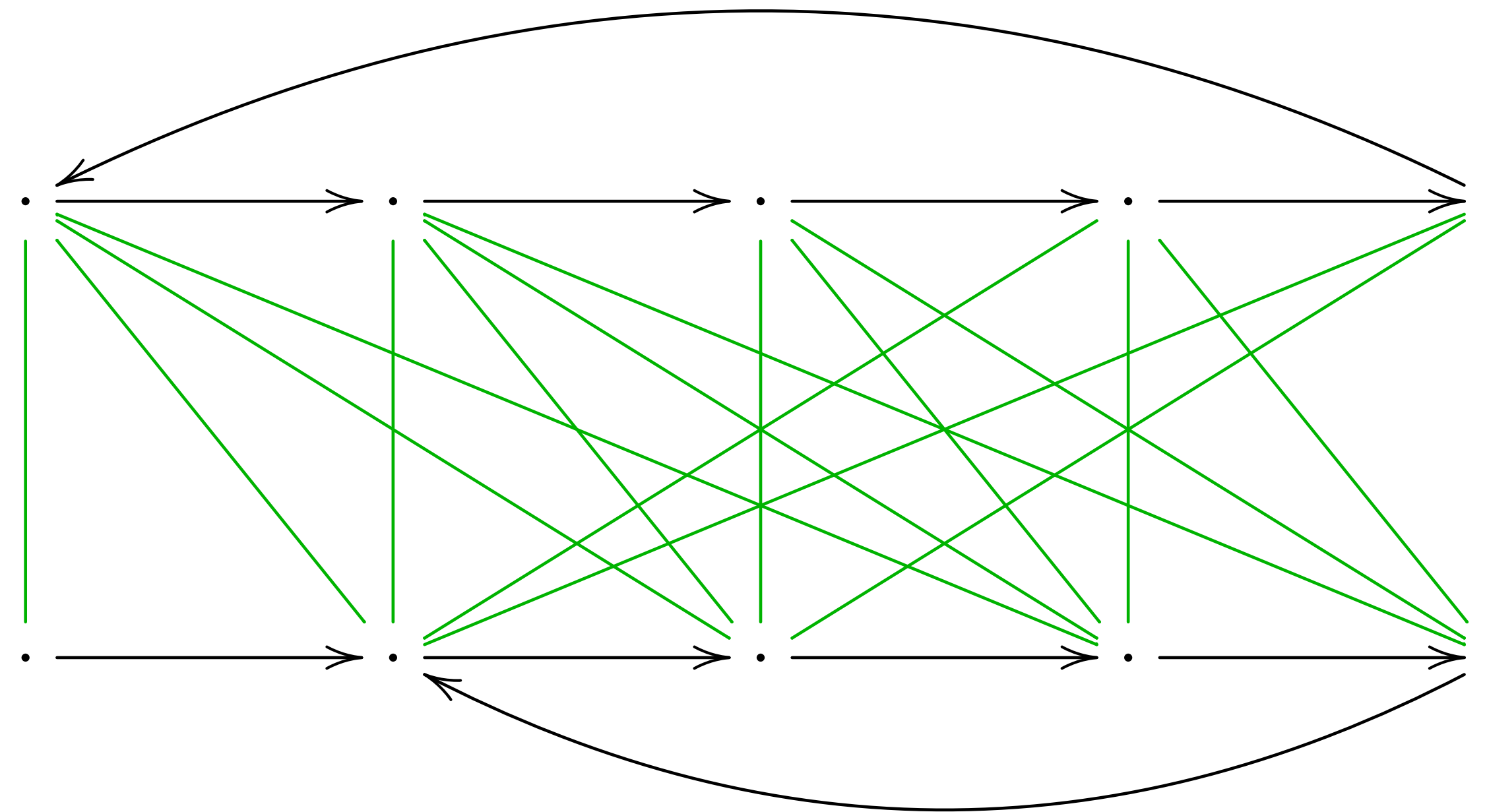
One can stop much earlier



~~21~~ 18 pairs

First improvement

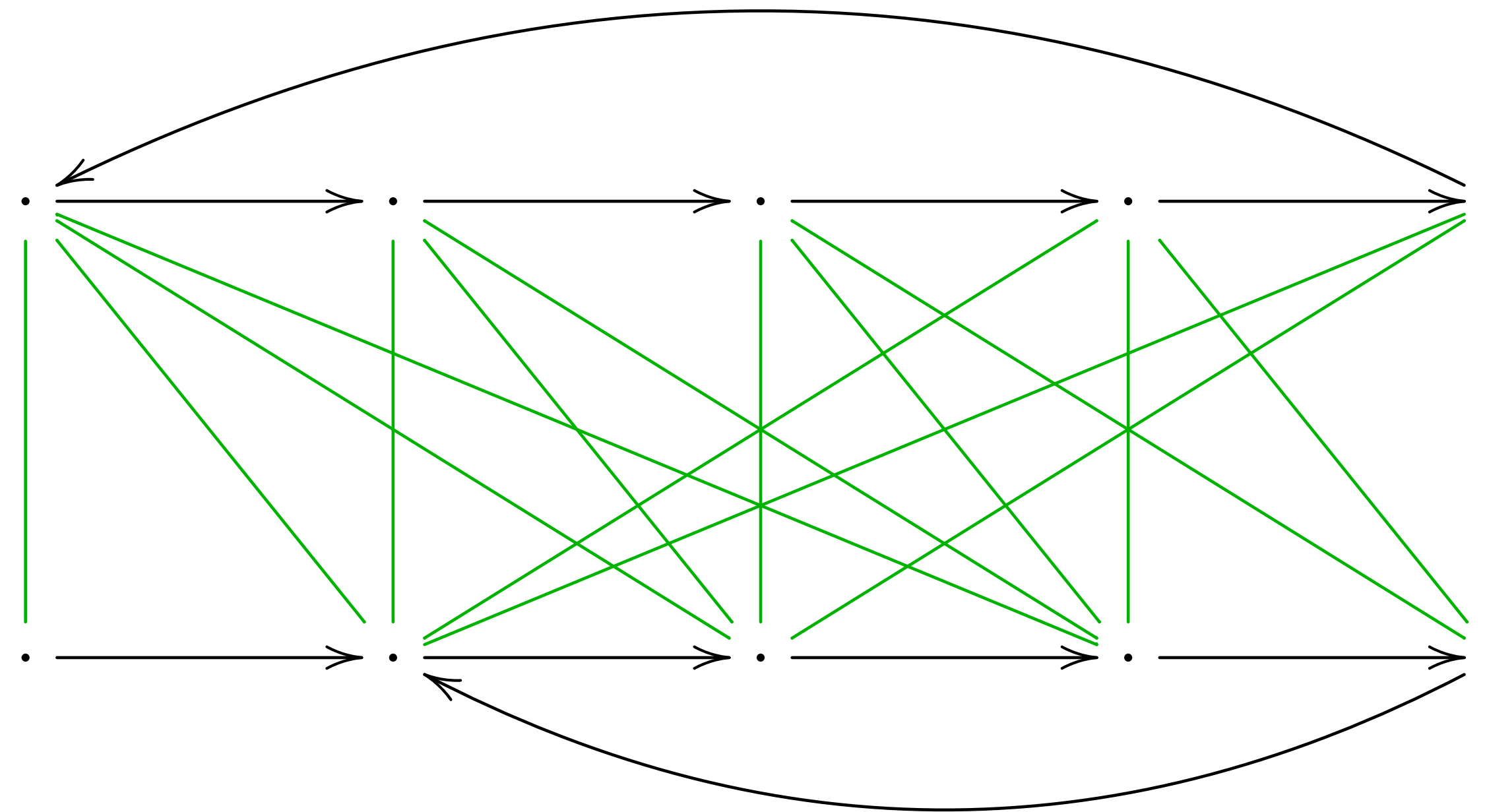
One can stop much earlier



~~21~~ 17 pairs

First improvement

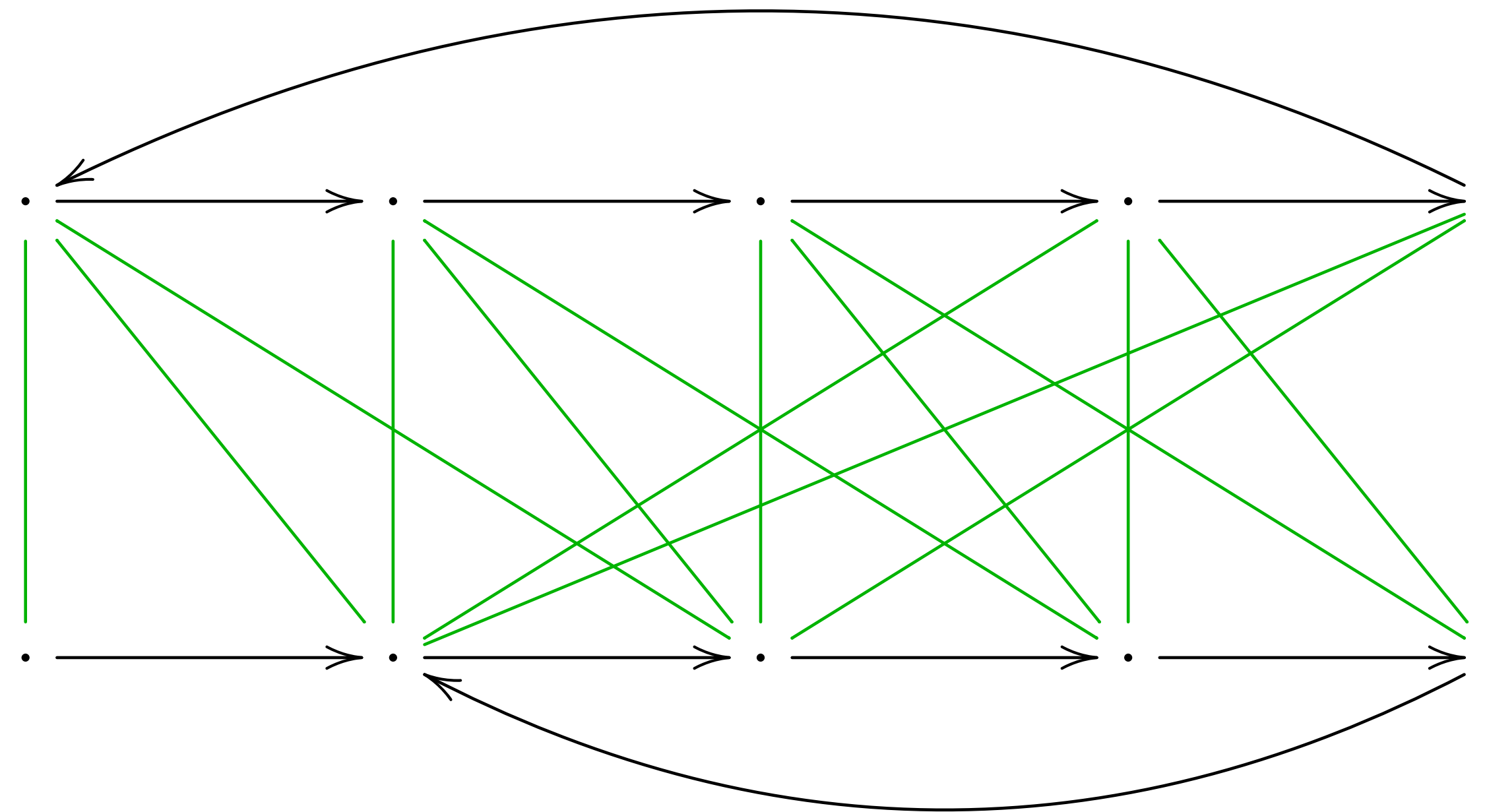
One can stop much earlier



~~21~~ 16 pairs

First improvement

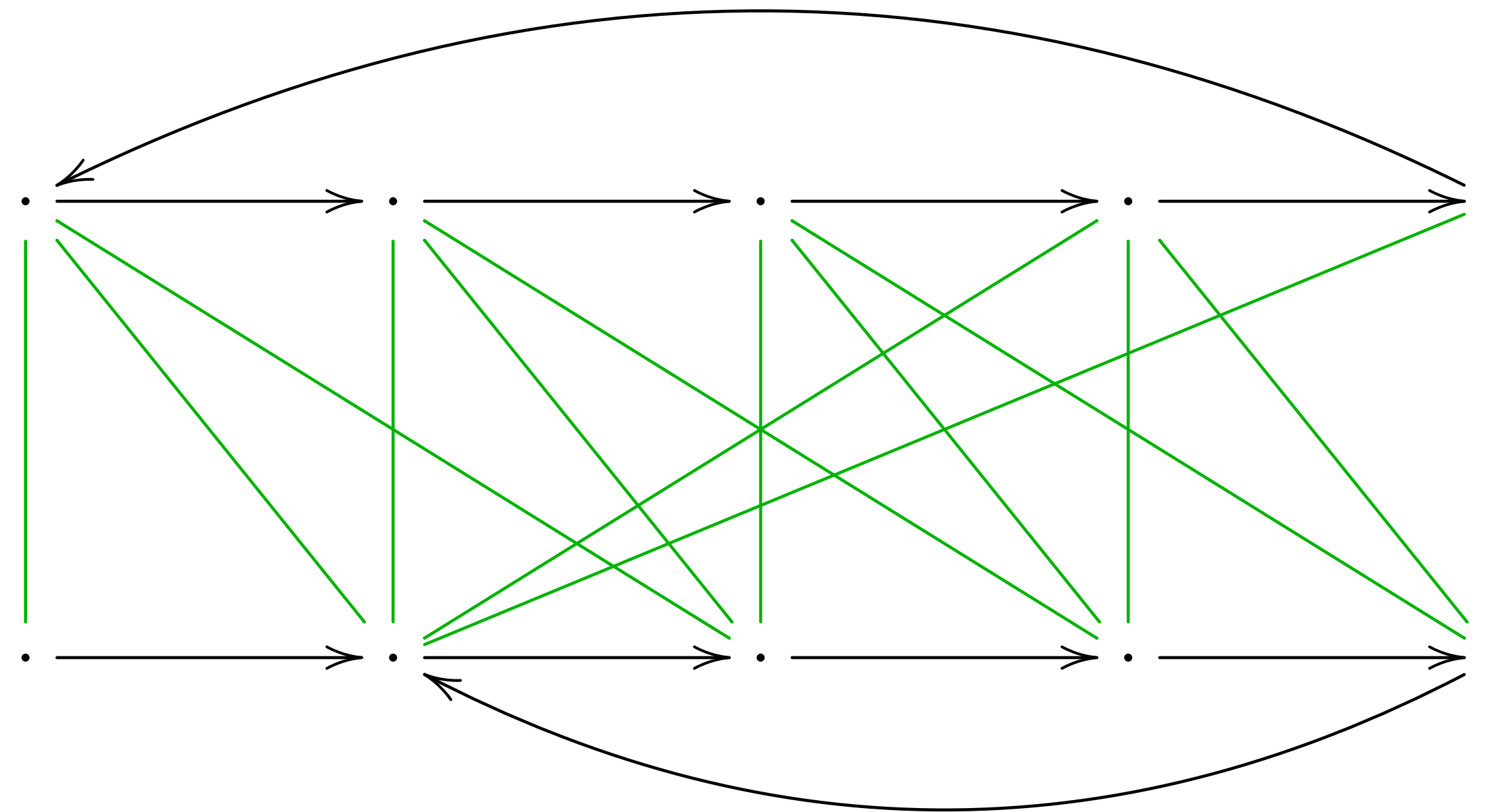
One can stop much earlier



~~21~~ 15 pairs

First improvement

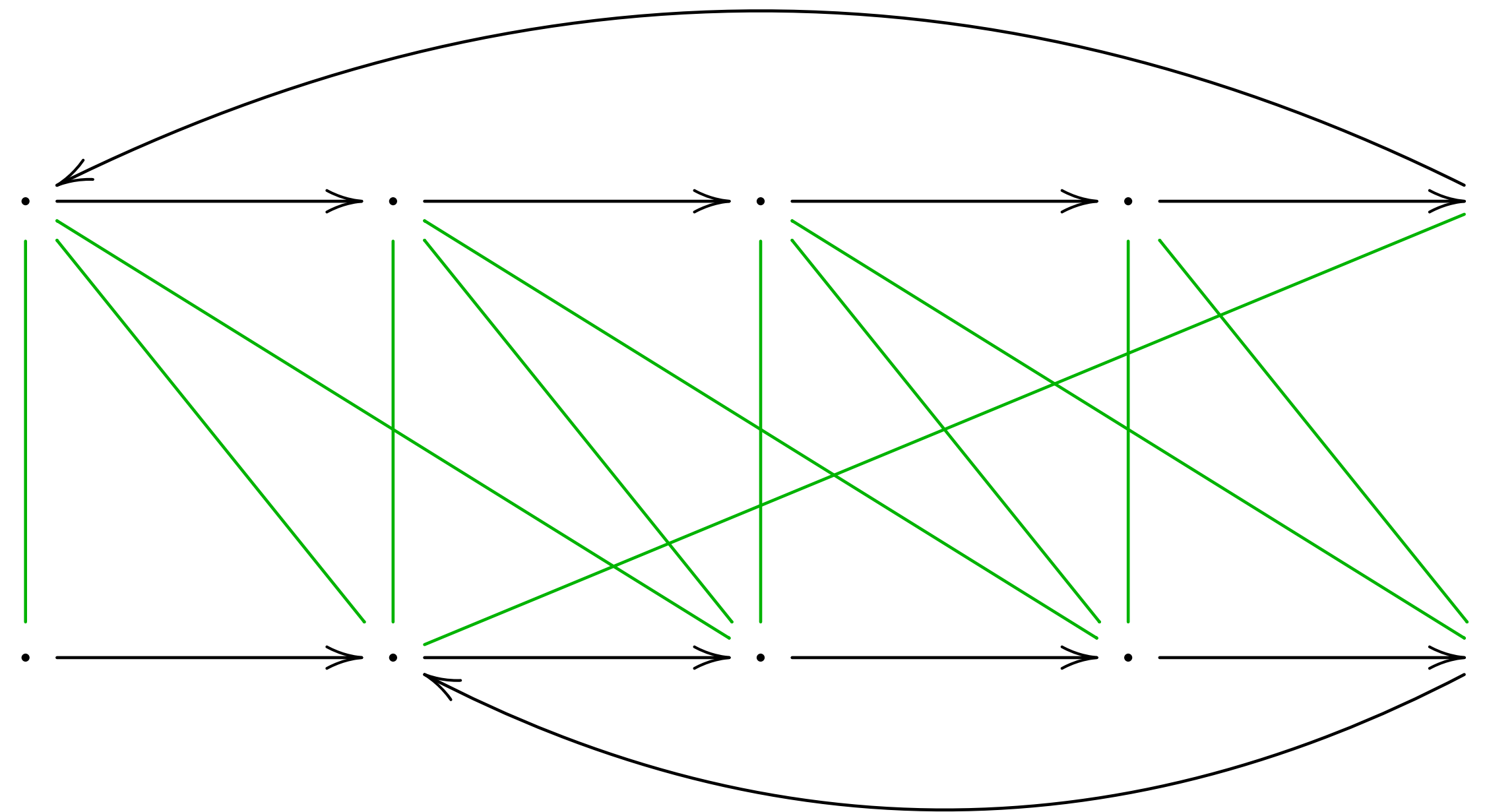
One can stop much earlier



~~21~~ 14 pairs

First improvement

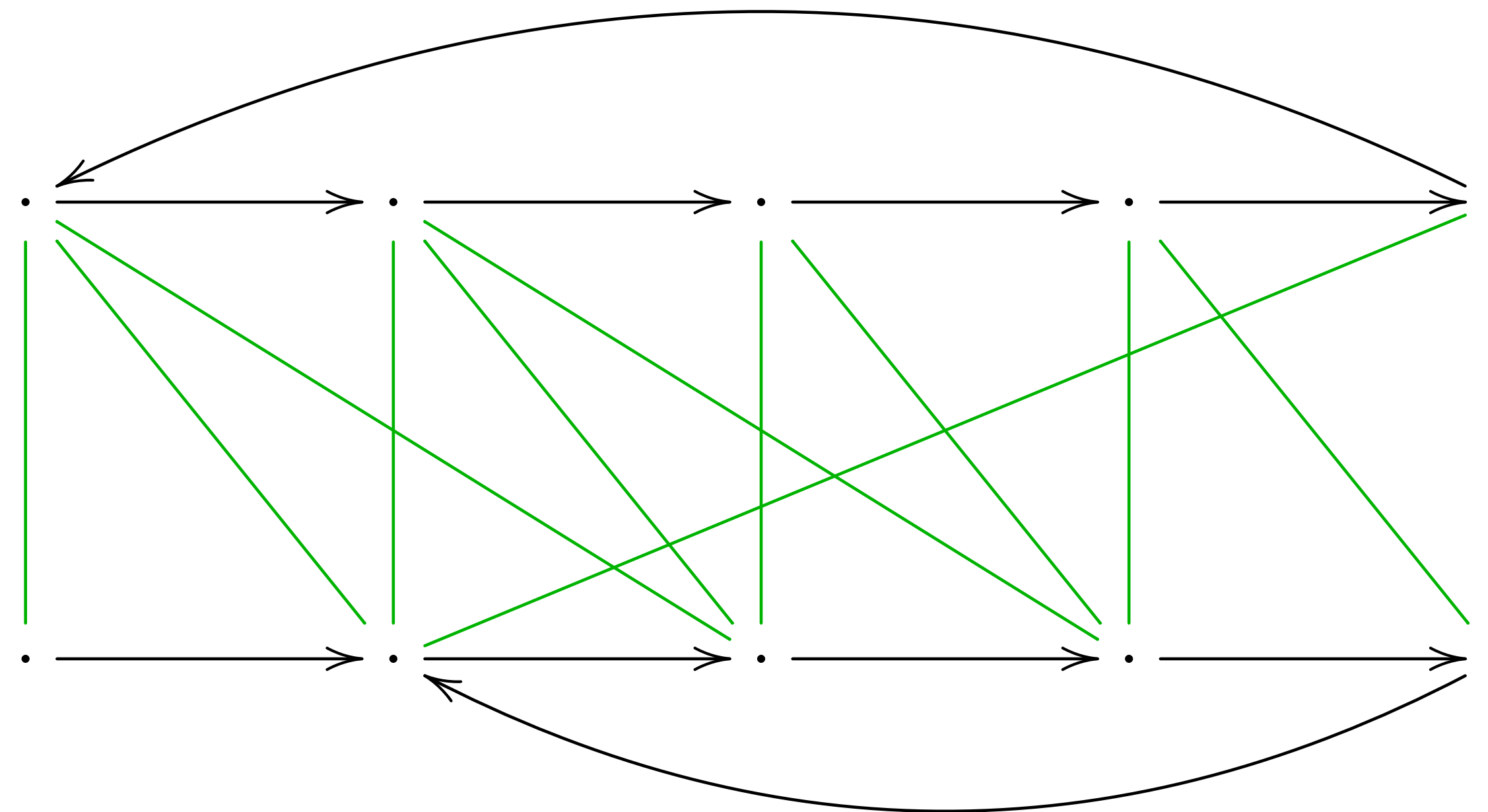
One can stop much earlier



~~21~~ 13 pairs

First improvement

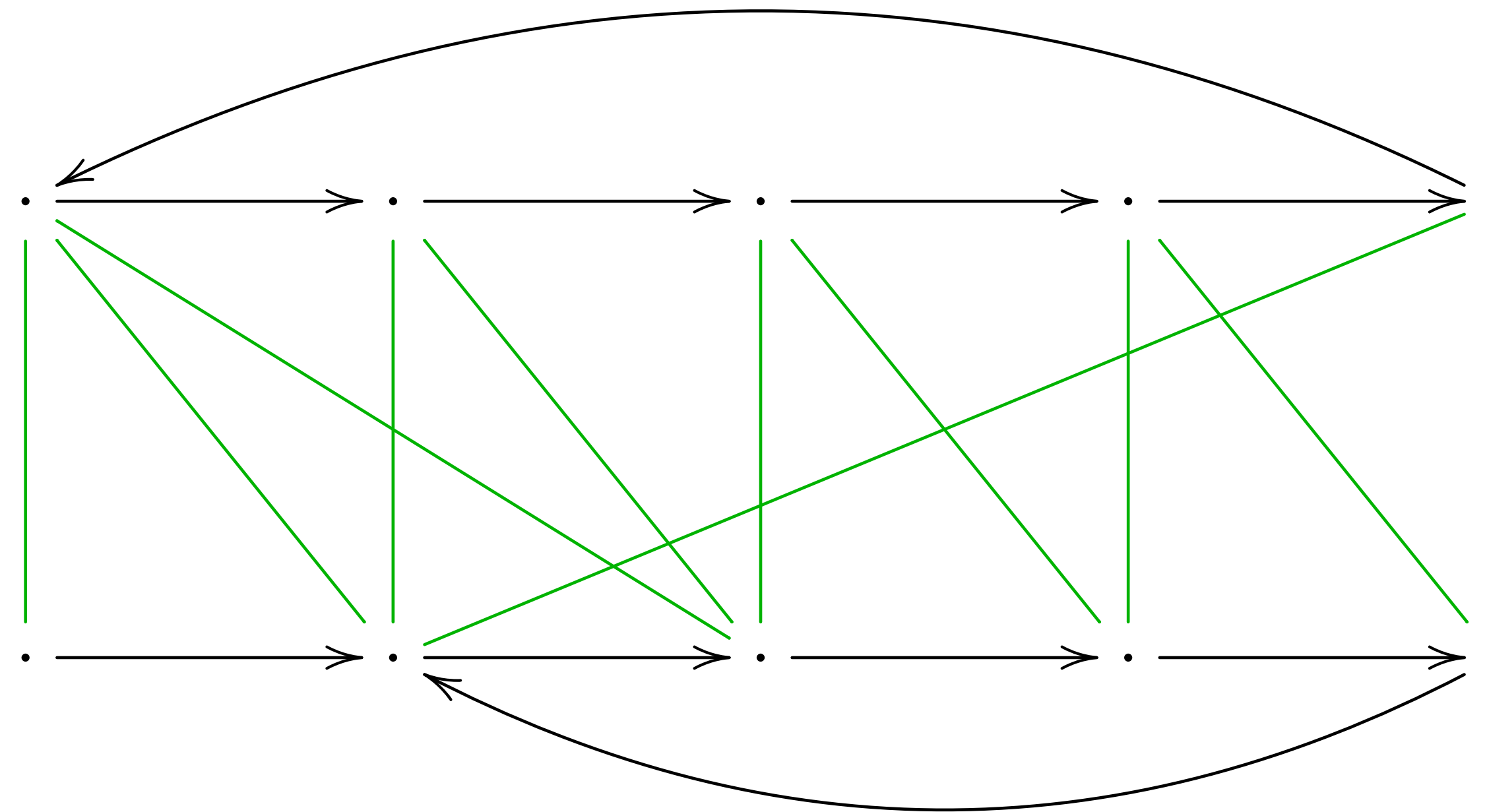
One can stop much earlier



~~21~~ 12 pairs

First improvement

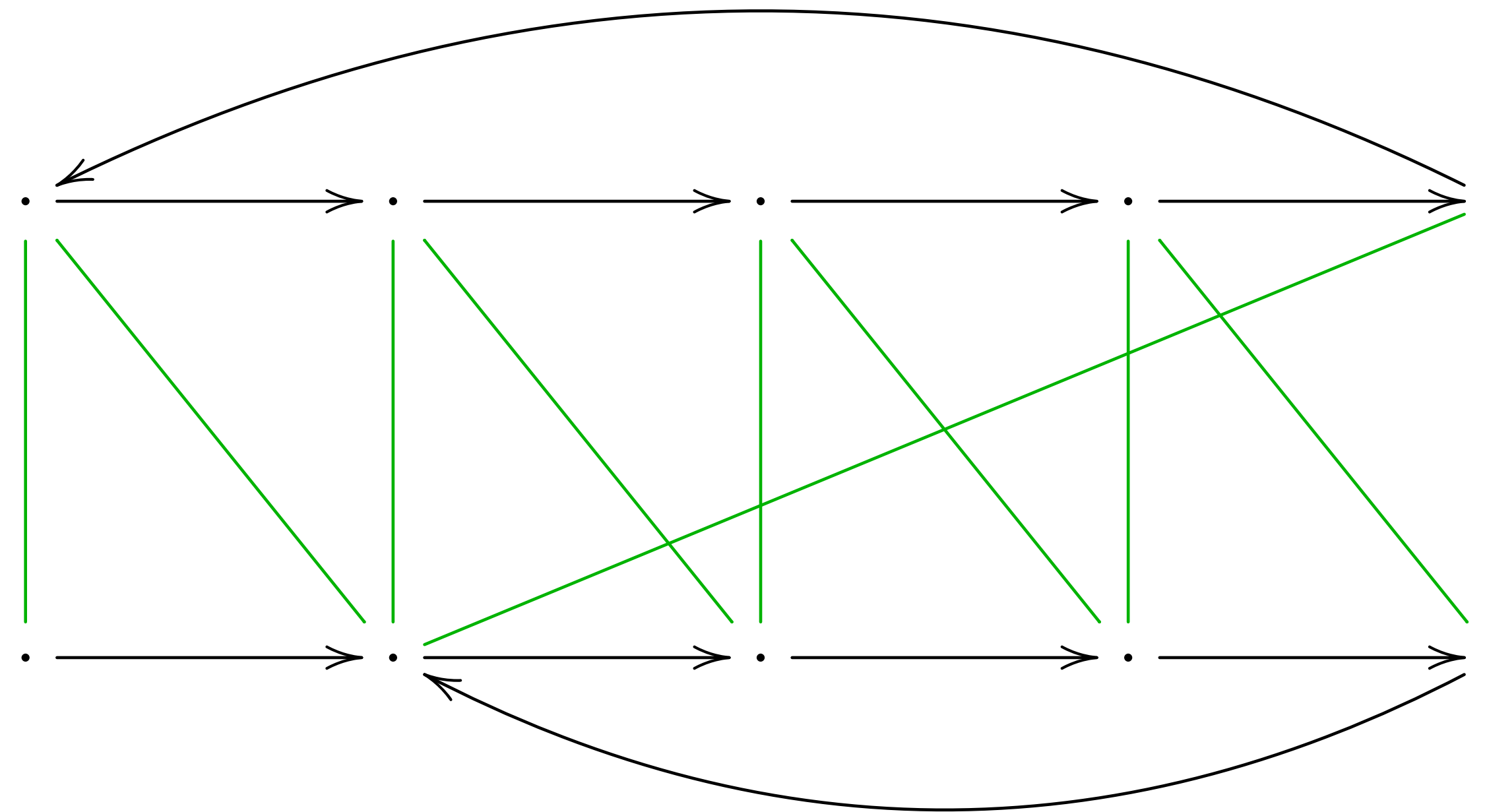
One can stop much earlier



~~21~~ 11 pairs

First improvement

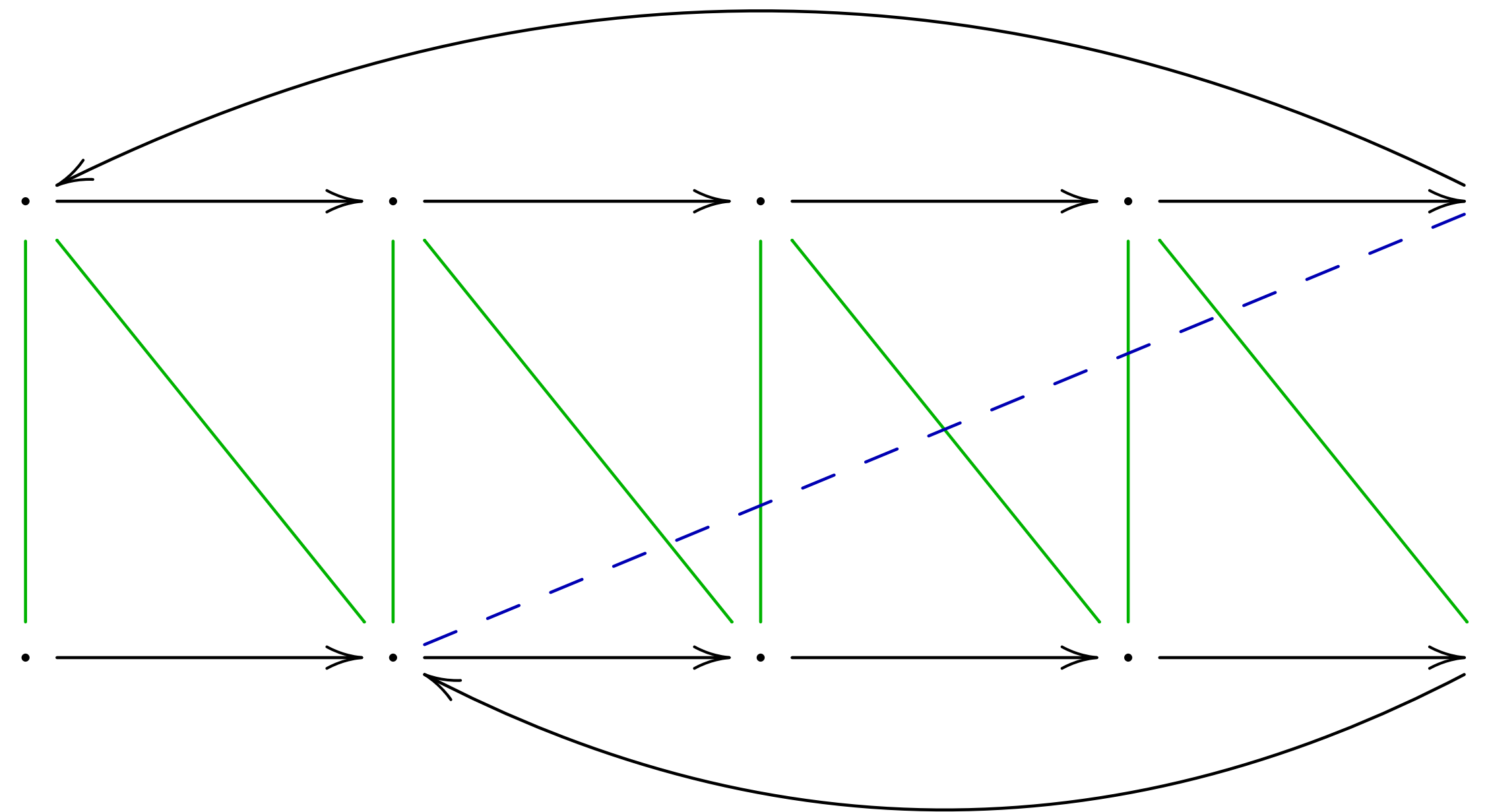
One can stop much earlier



~~21~~ 10 pairs

First improvement

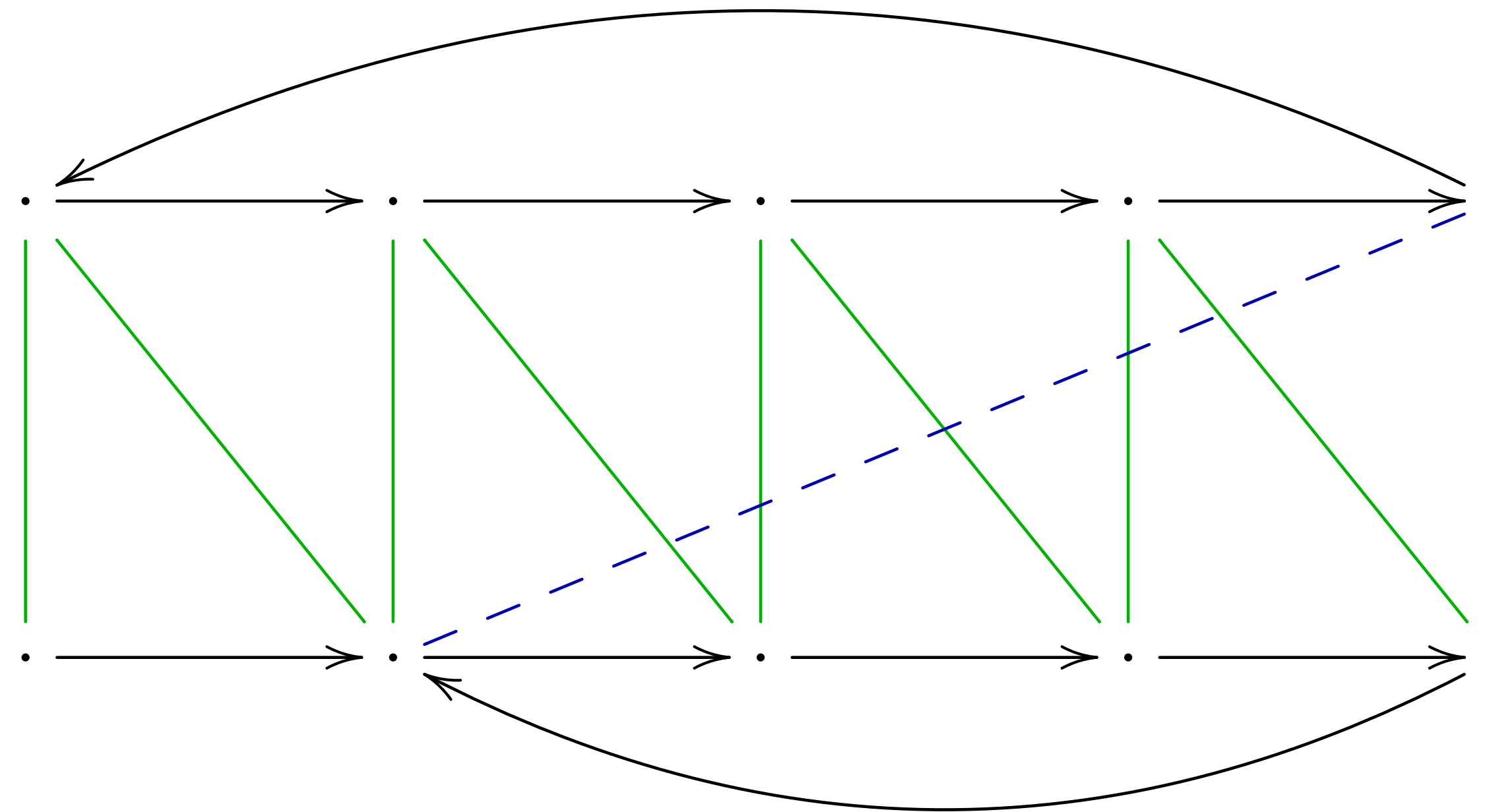
One can stop much earlier



~~21~~ 9 pairs

First improvement

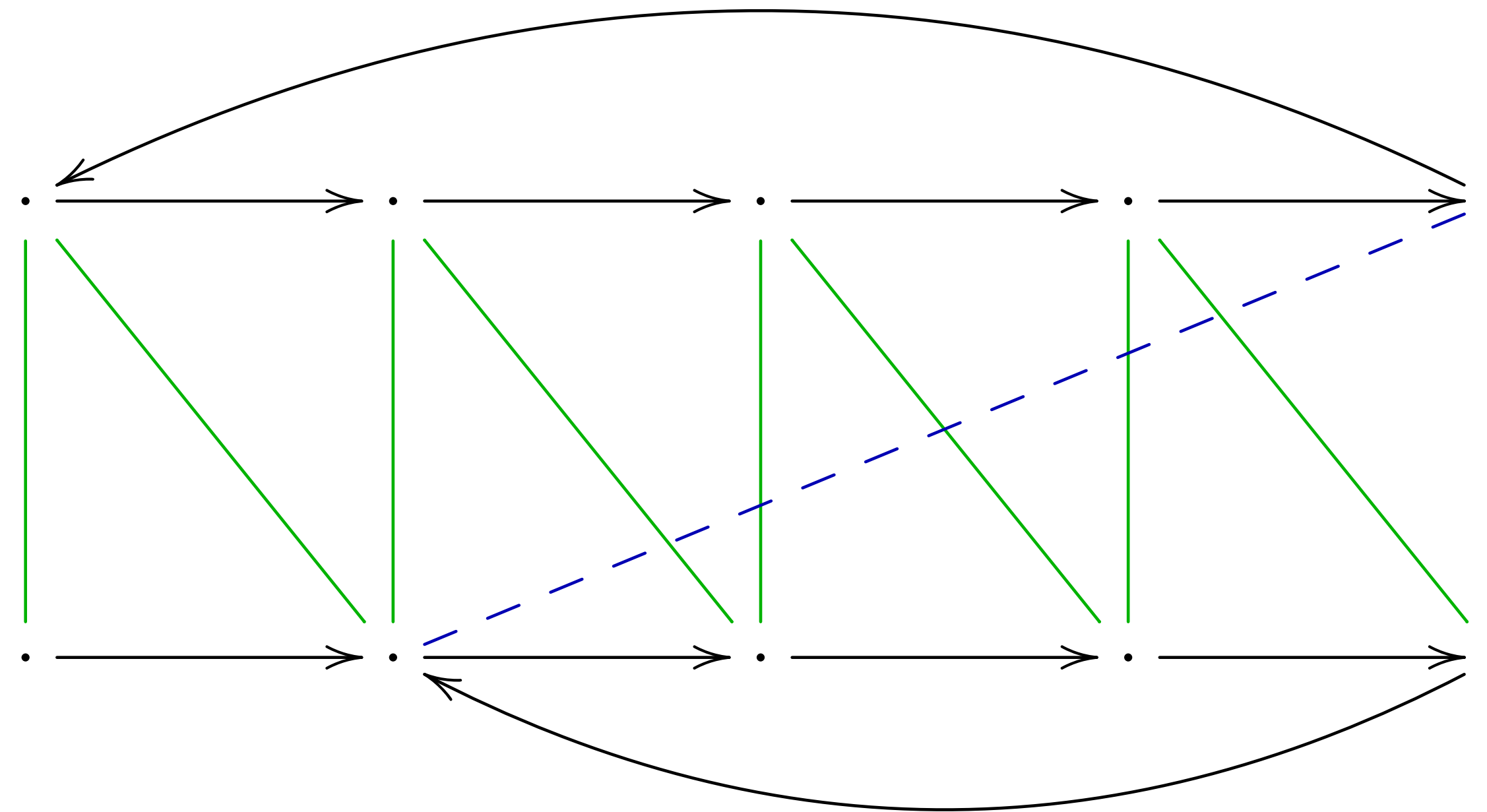
One can stop much earlier



[Hopcroft and Karp '71]

First improvement

One can stop much earlier



Complexity: almost linear

[Hopcroft and Karp '71]

[Tarjan '75]

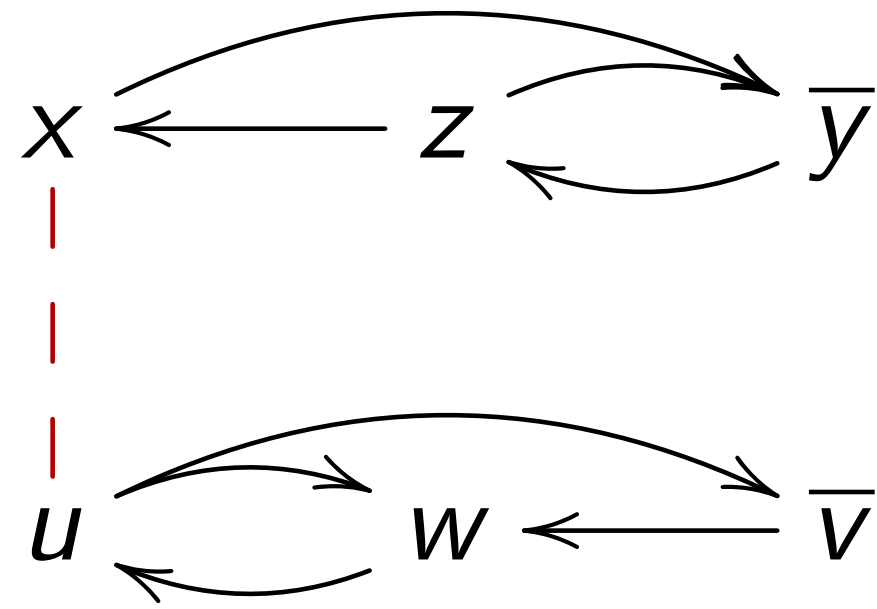
Correctness of the improvement

Correctness of HK algorithm, revisited:

- ▶ The previous relation is **not** a bisimulation - proof of equivalence
- ▶ But can be completed to one using equivalence - transitivity
- ▶ Hopcroft and Karp's algorithm ('71) attempts to construct a bisimulation up to equivalence

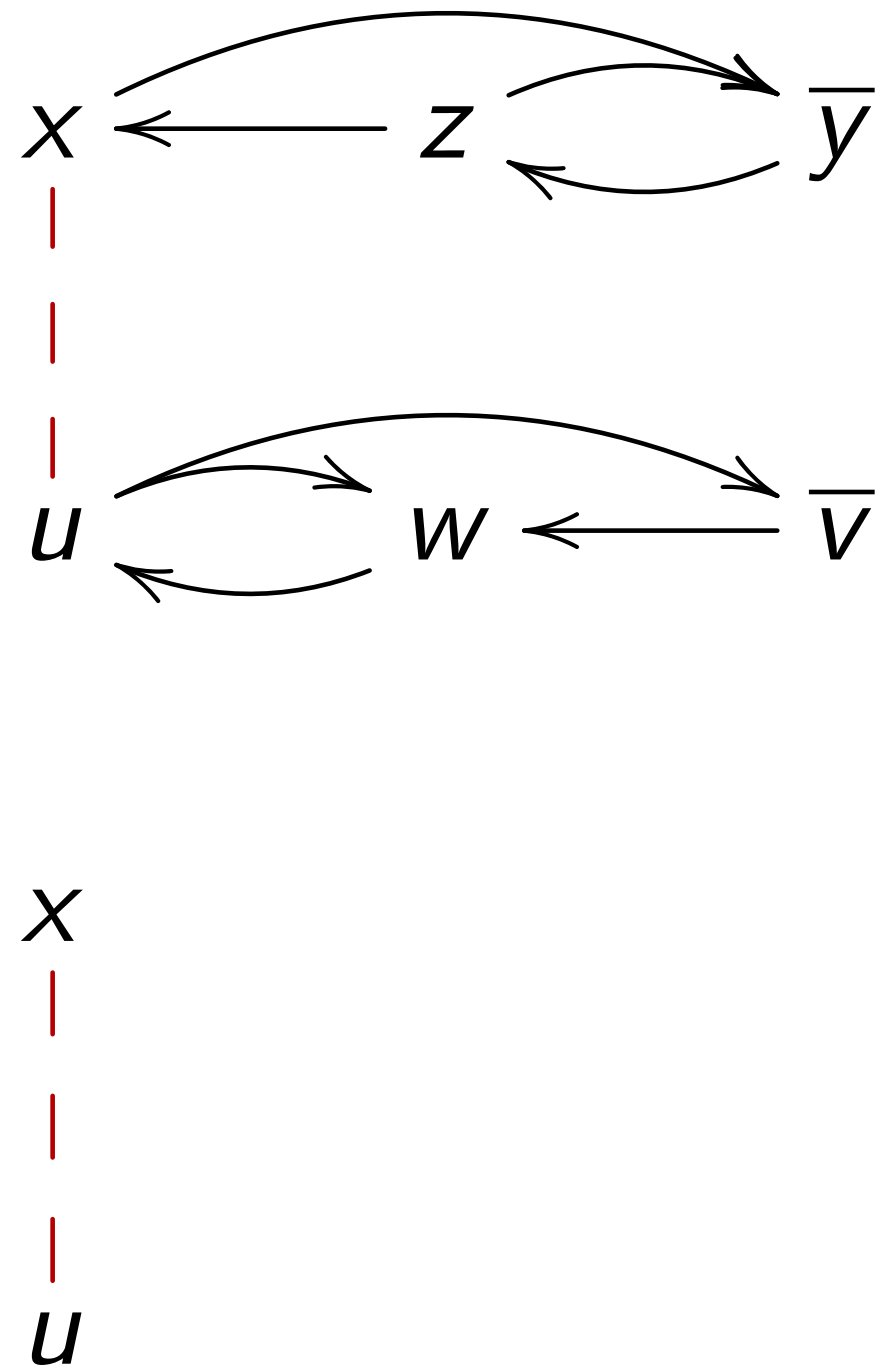
Non-Deterministic Automata

Use Hopcroft and Karp *on the fly*, through the powerset construction:



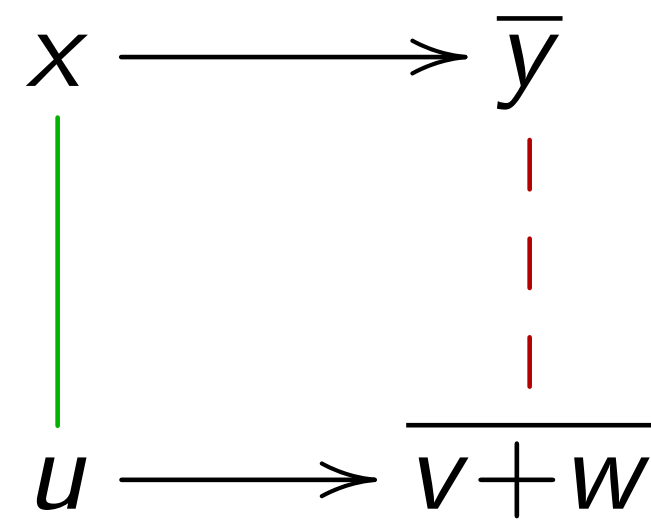
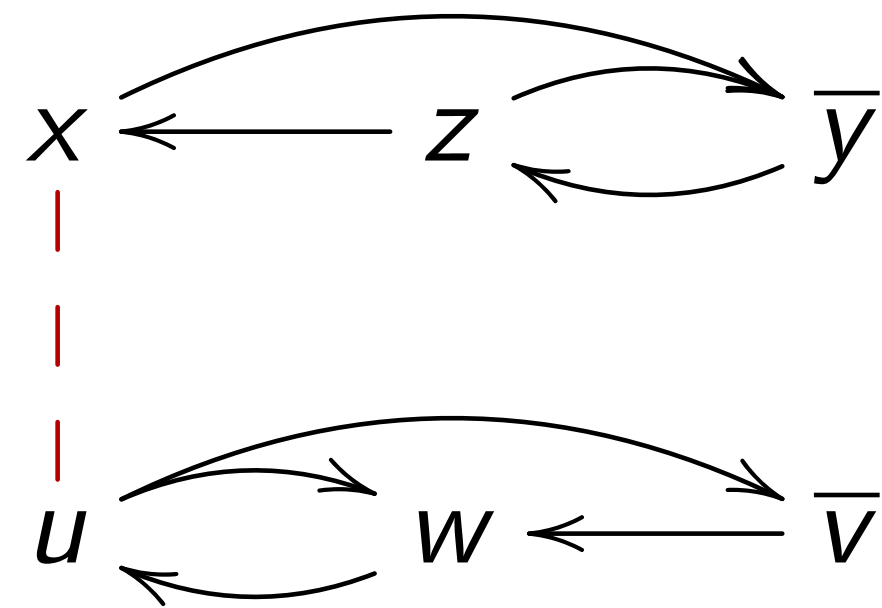
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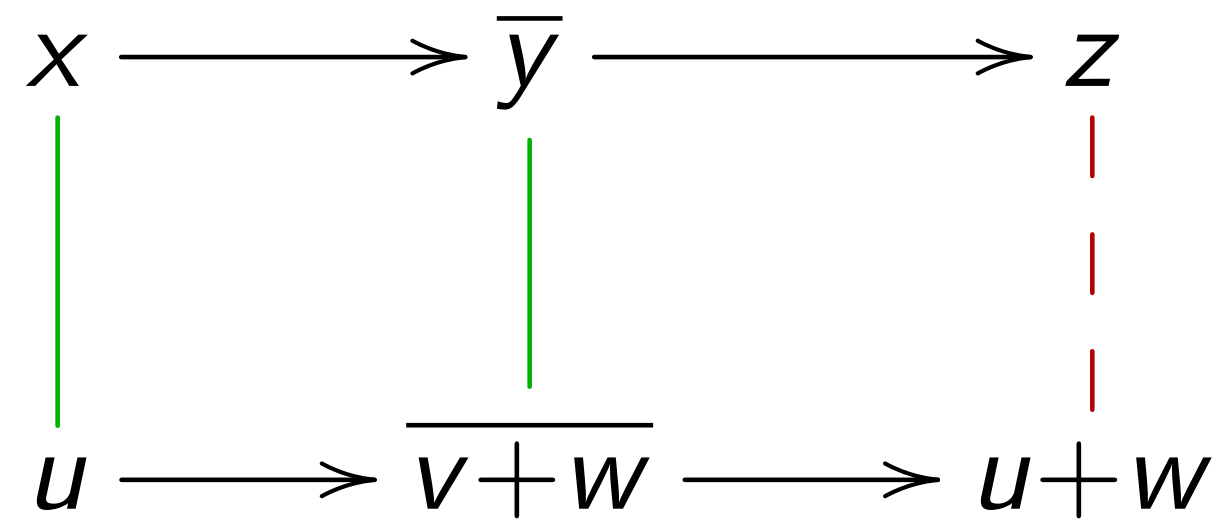
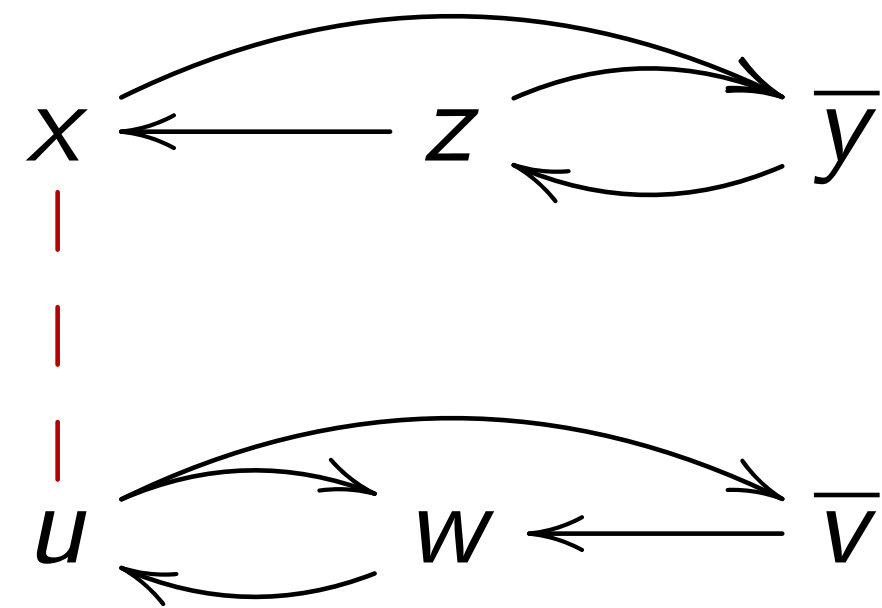
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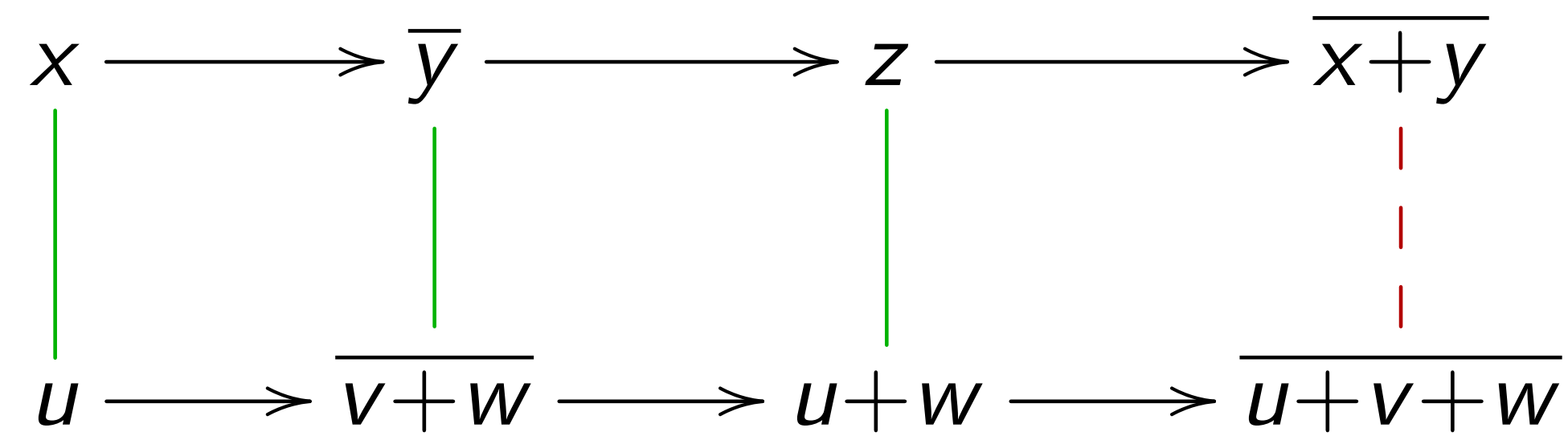
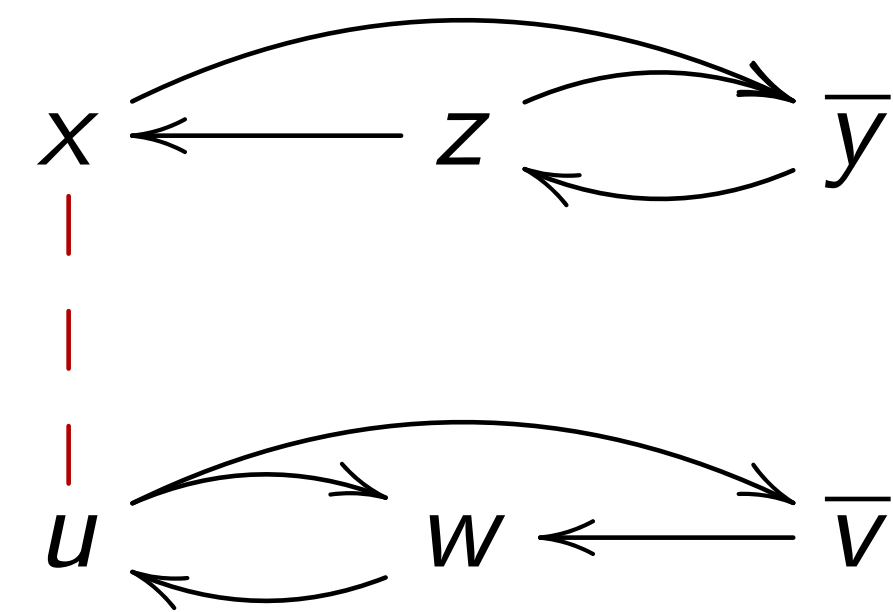
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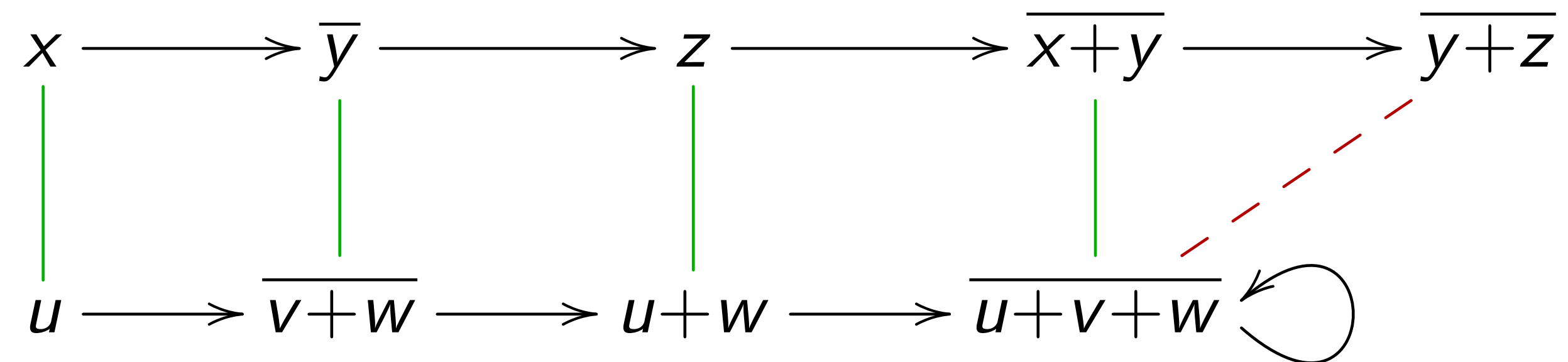
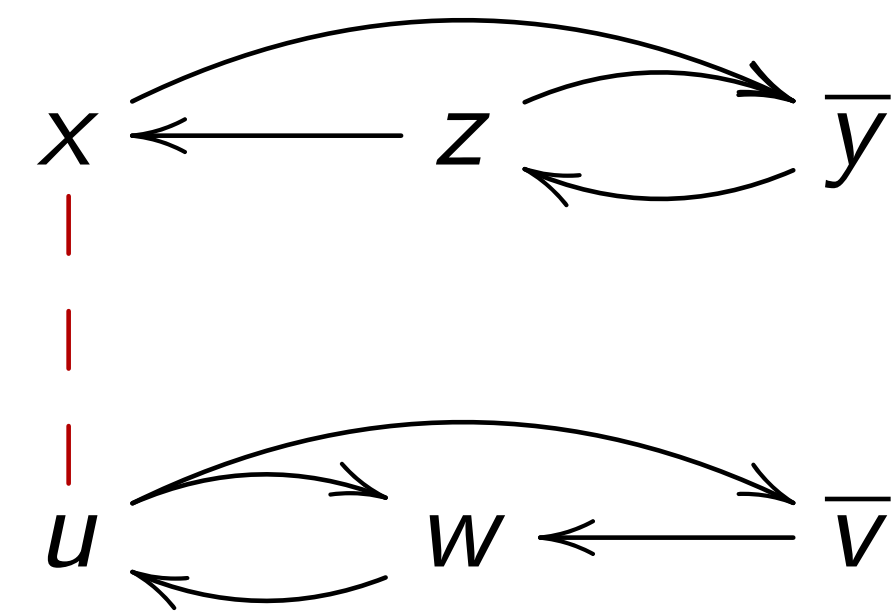
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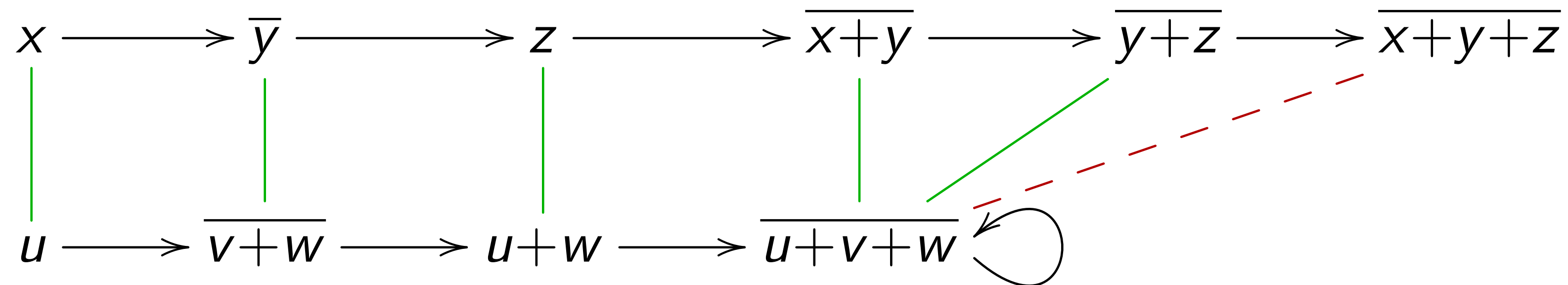
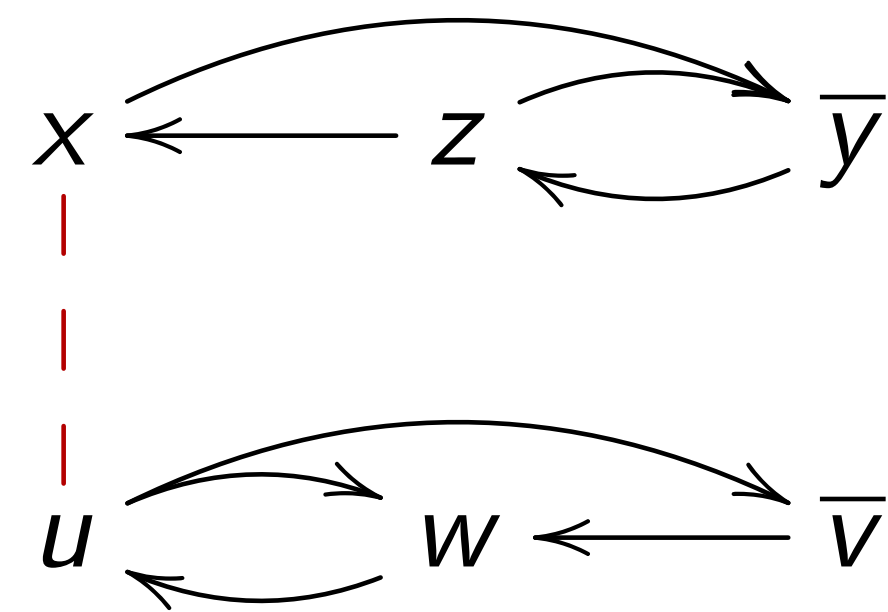
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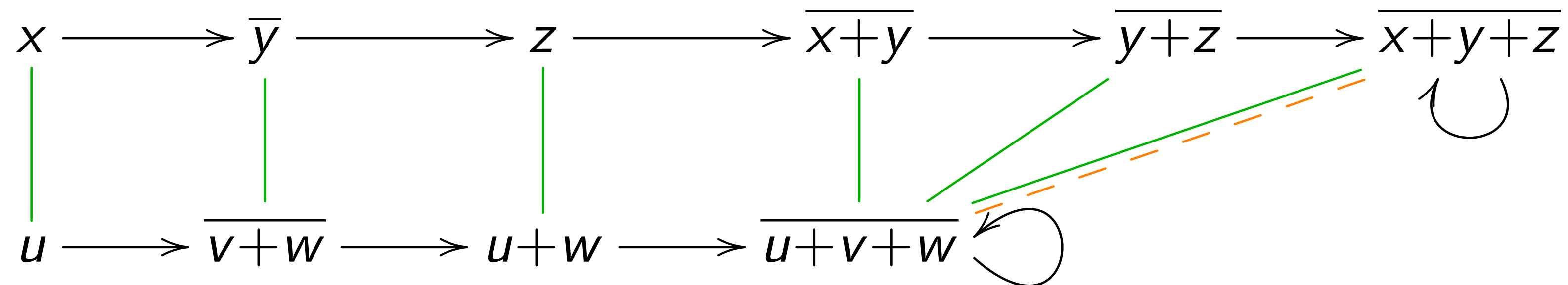
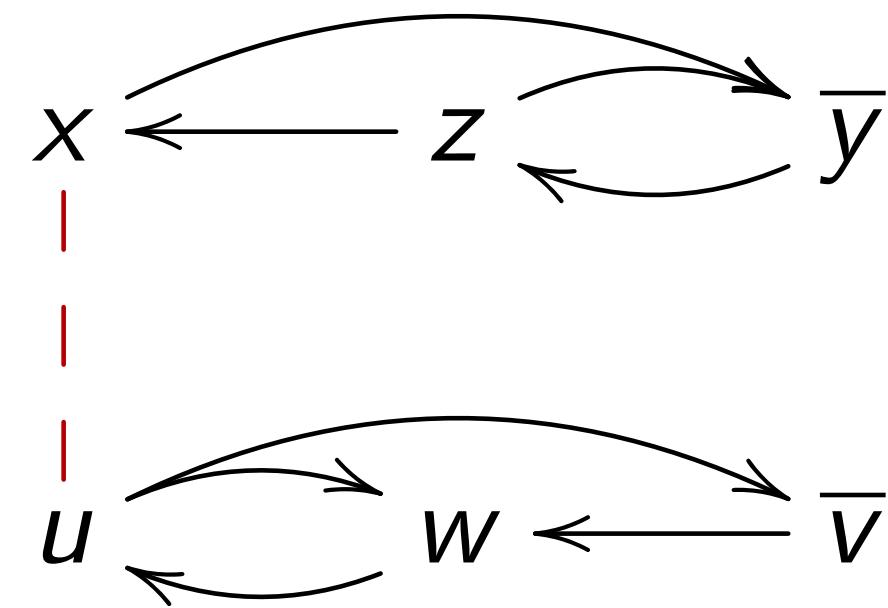
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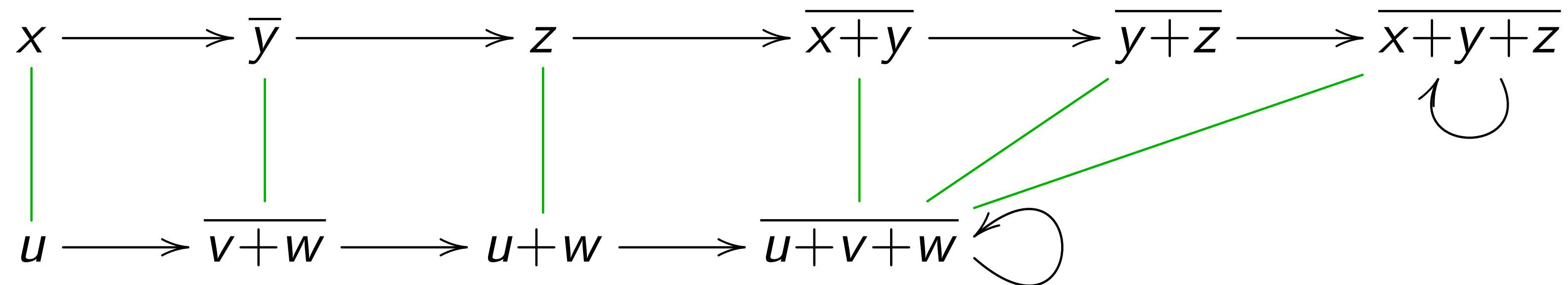
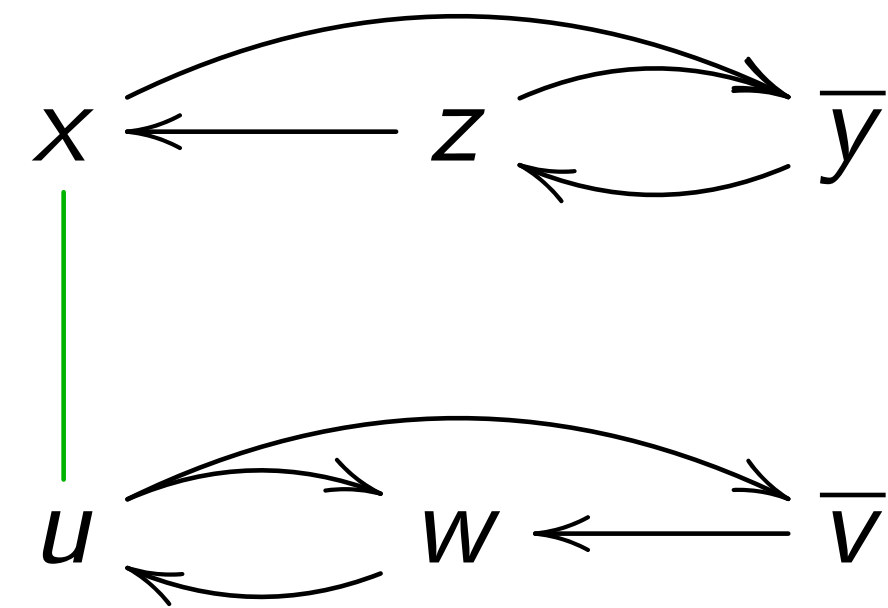
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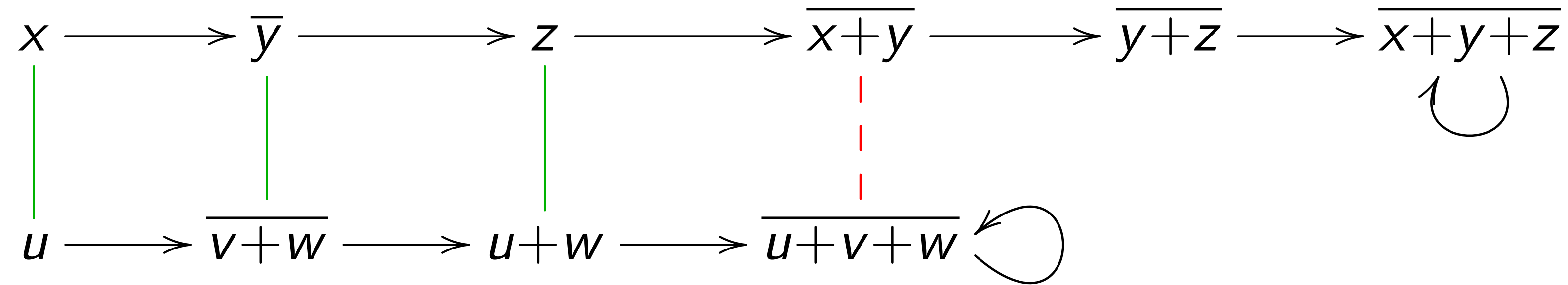
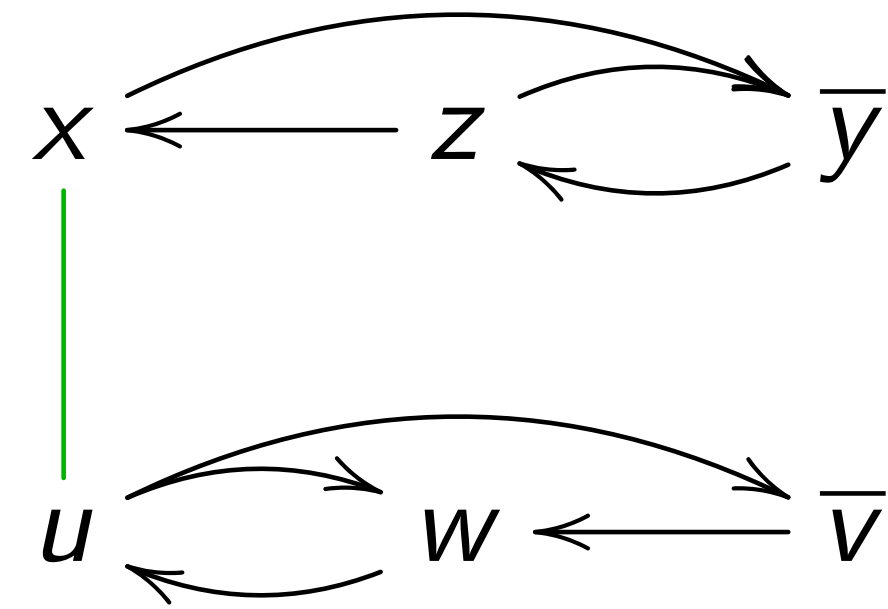
Non-Deterministic Automata

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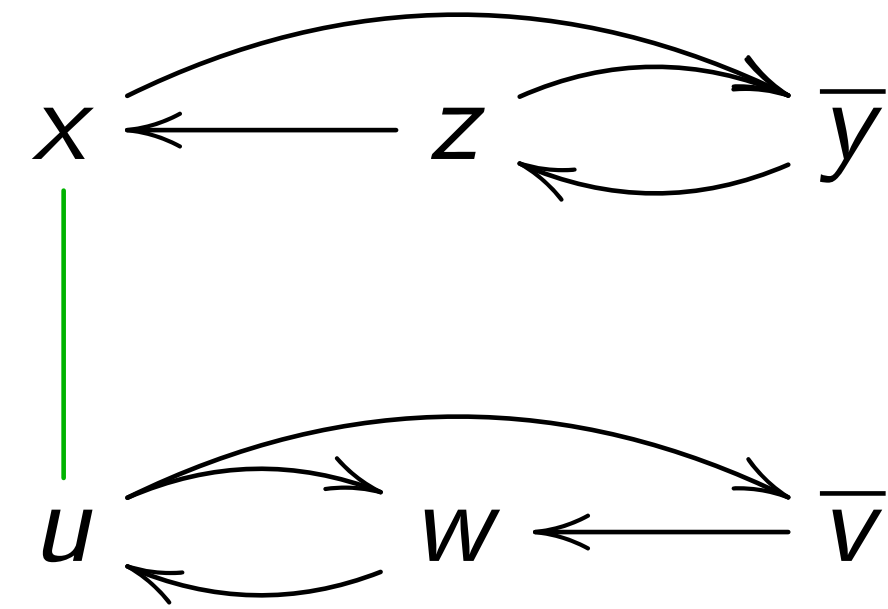
Non-Deterministic Automata

One can do **better**:

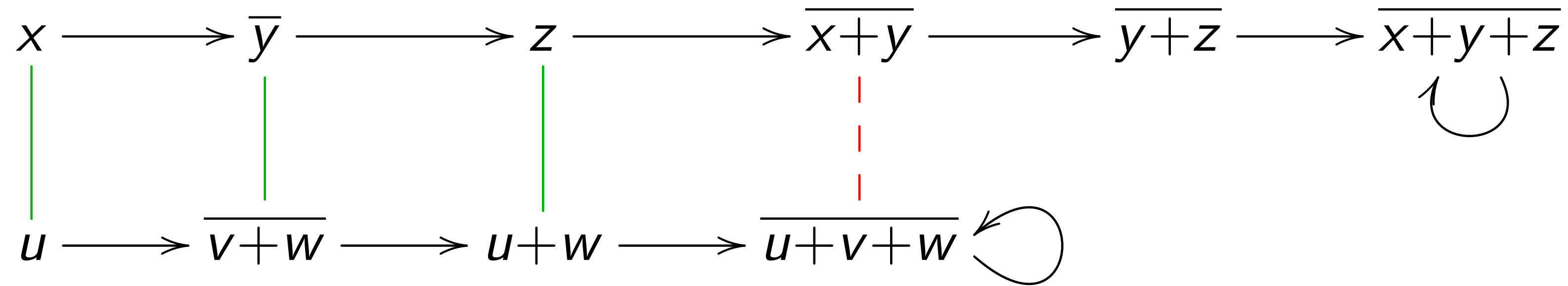


Non-Deterministic Automata

One can do **better**:

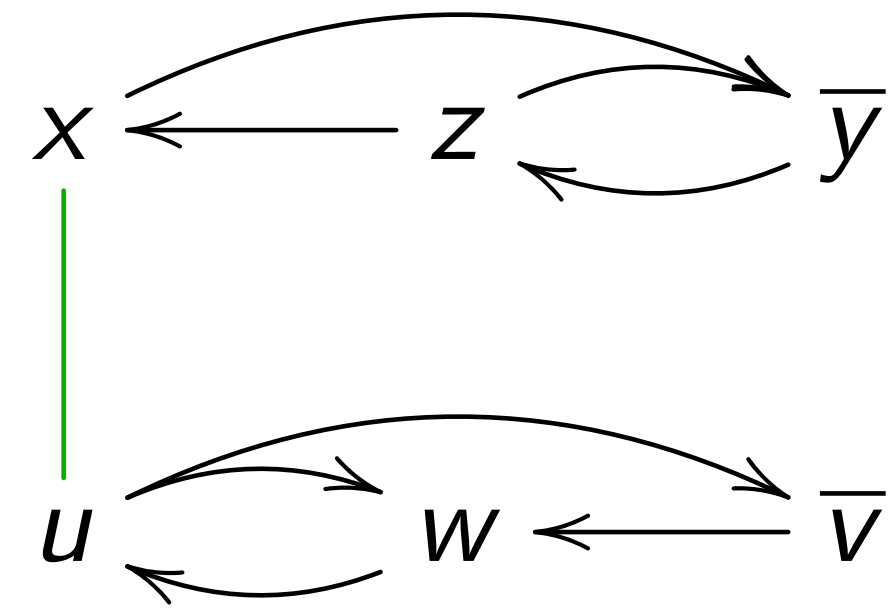


$$\frac{\begin{matrix} (x, u) \\ + \\ (y, v+w) \end{matrix}}{= (x+y, u+v+w)}$$

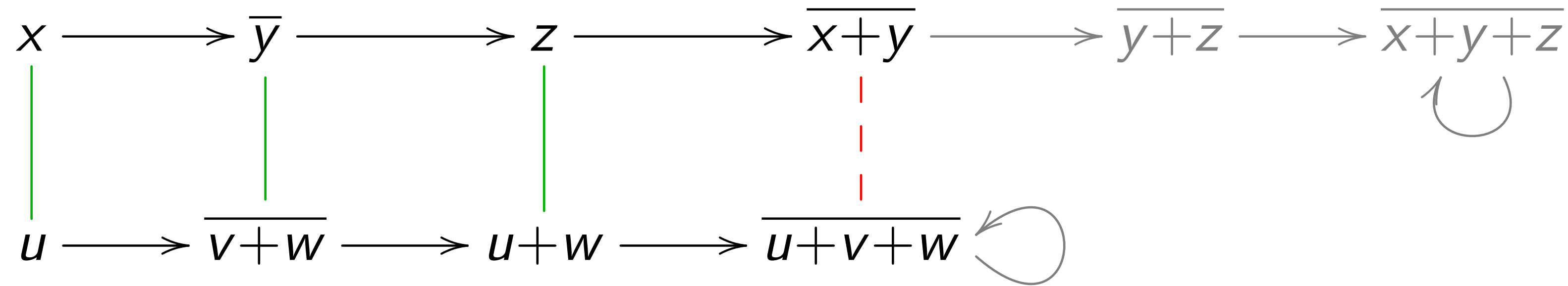


Non-Deterministic Automata

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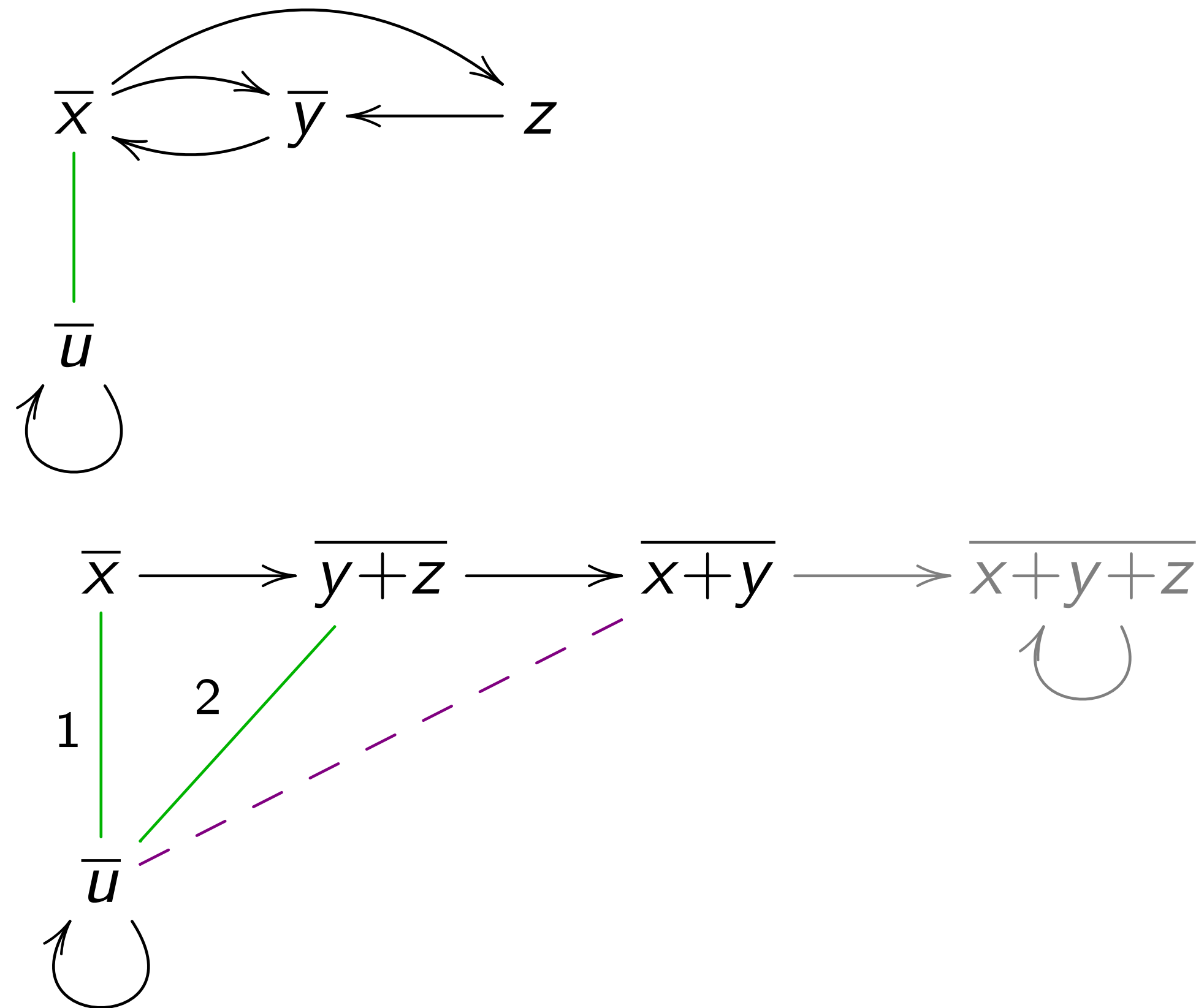
$$\frac{\begin{array}{l} (x, u) \\ + \quad (y, v+w) \end{array}}{= (x+y, u+v+w)}$$



using bisimulations **up to union**

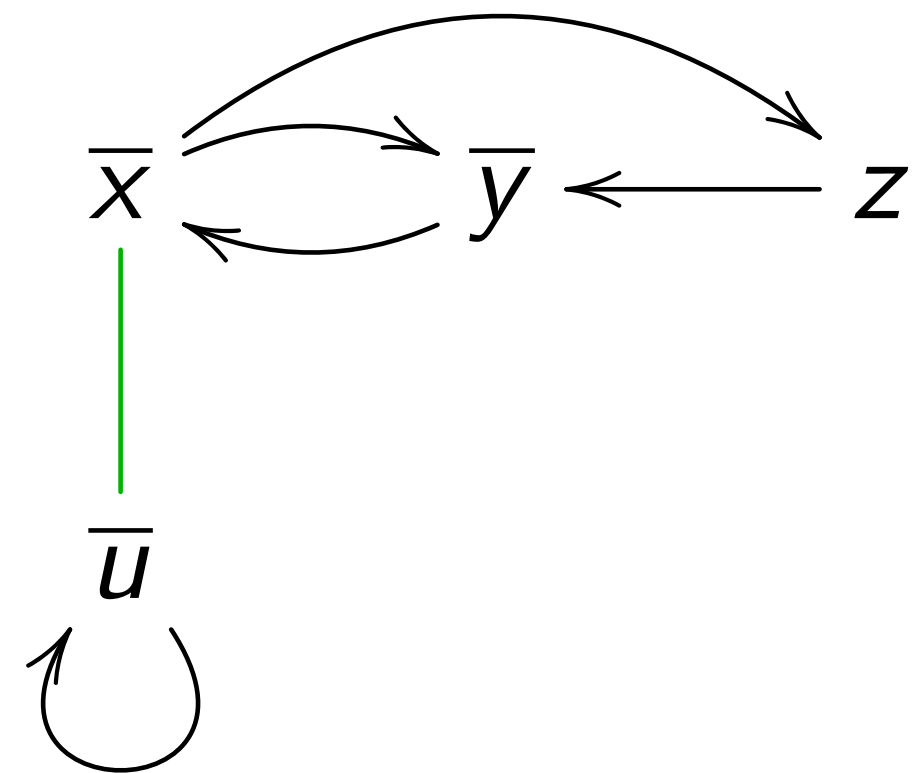
Non-Deterministic Automata

One can do **even** better:



Non-Deterministic Automata

One can do **even** better:

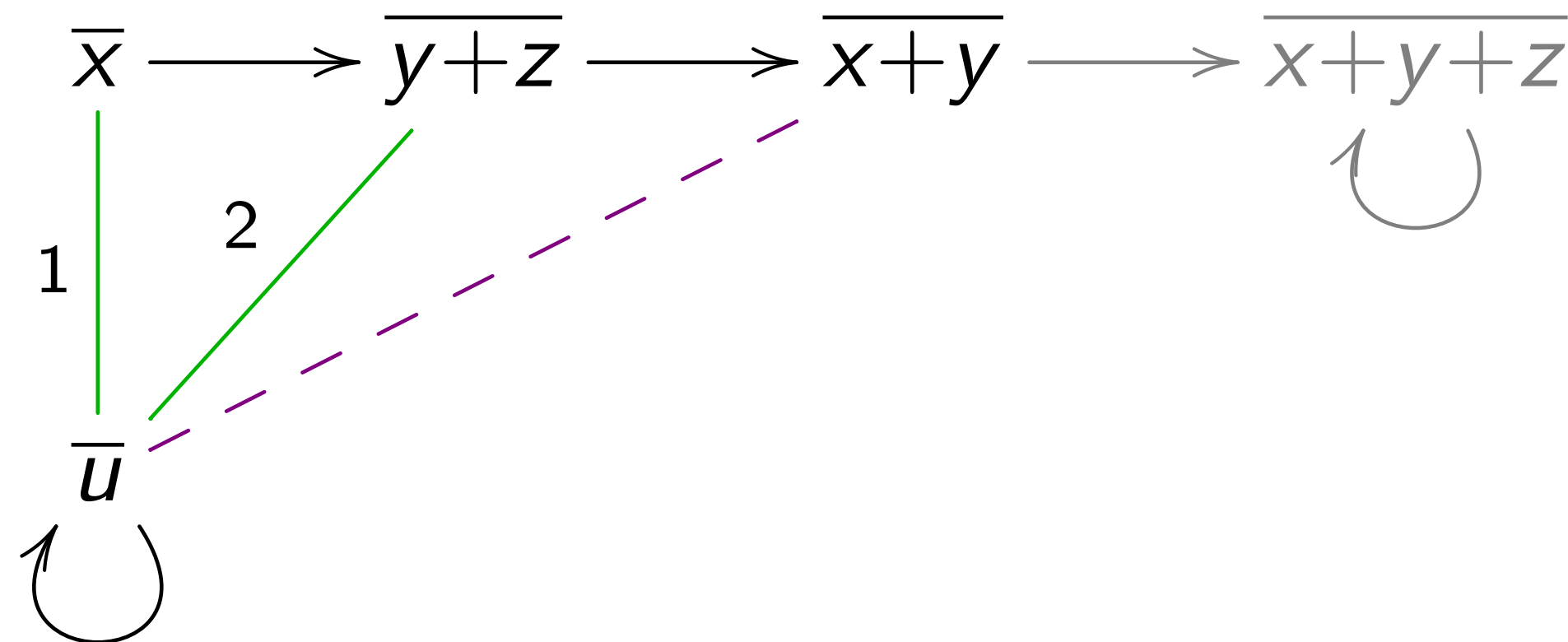


$$x+y = u+y \quad (1)$$

$$= y+z+y \quad (2)$$

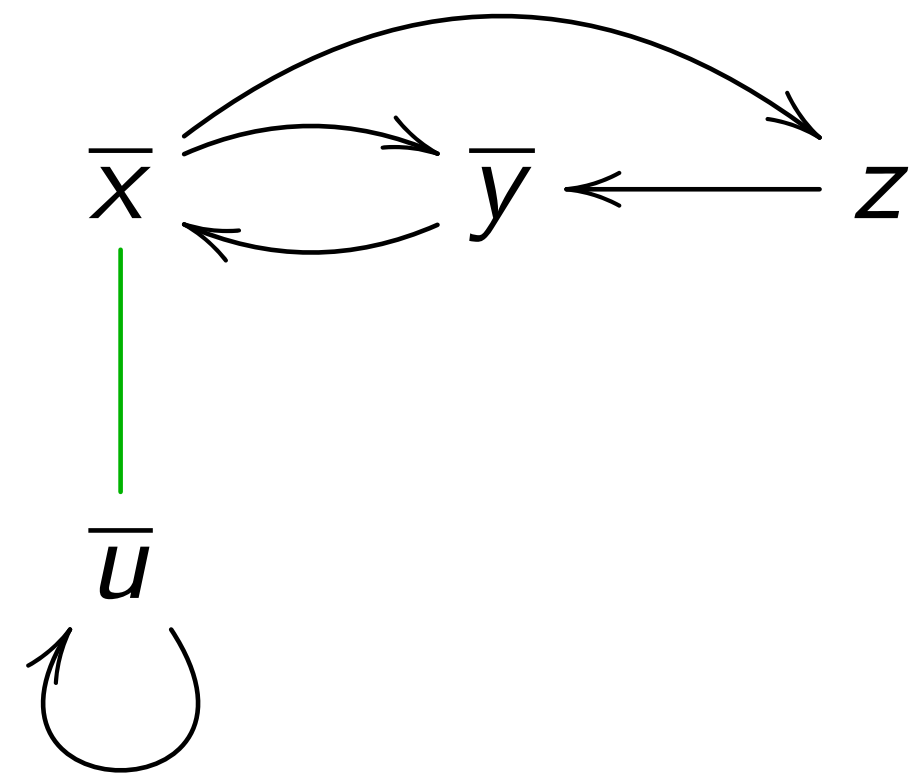
$$= y+z$$

$$= u \quad (2)$$



Non-Deterministic Automata

One can do **even** better:

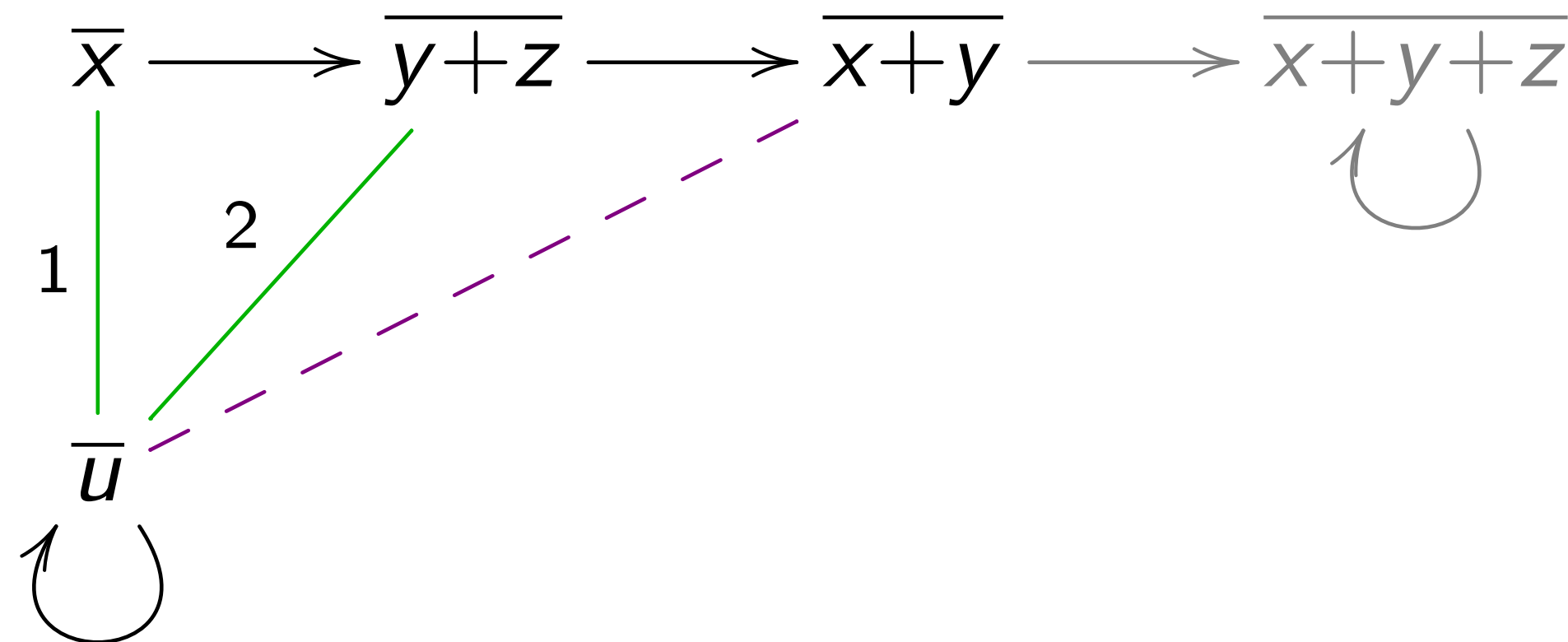


$$x+y = u+y \quad (1)$$

$$= y+z+y \quad (2)$$

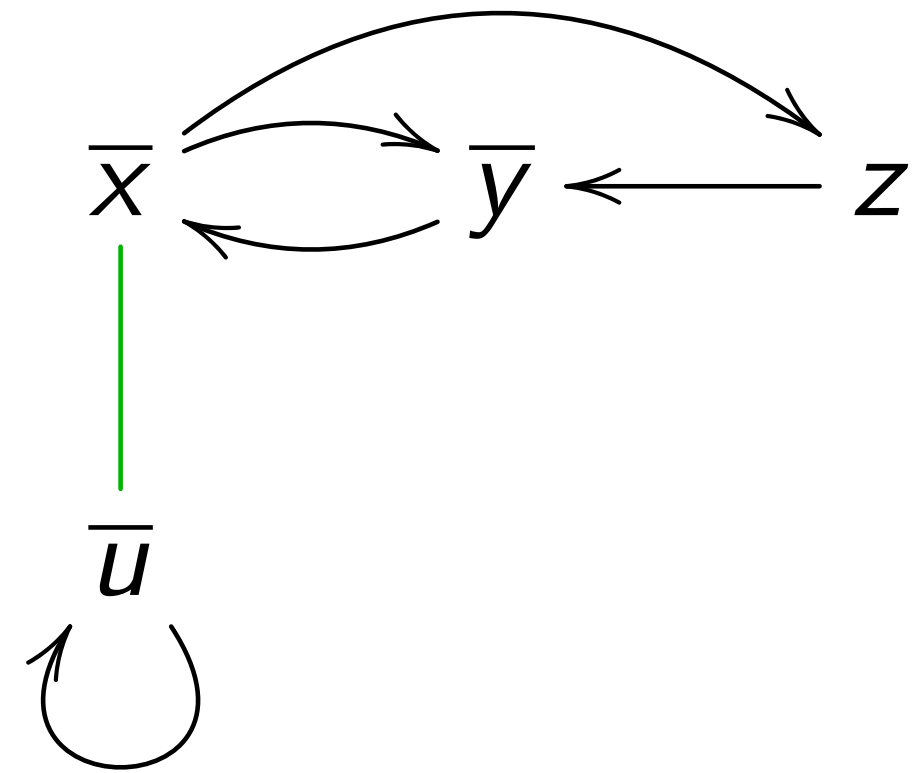
$$= y+z$$

$$= u \quad (2)$$



Non-Deterministic Automata

One can do **even** better:

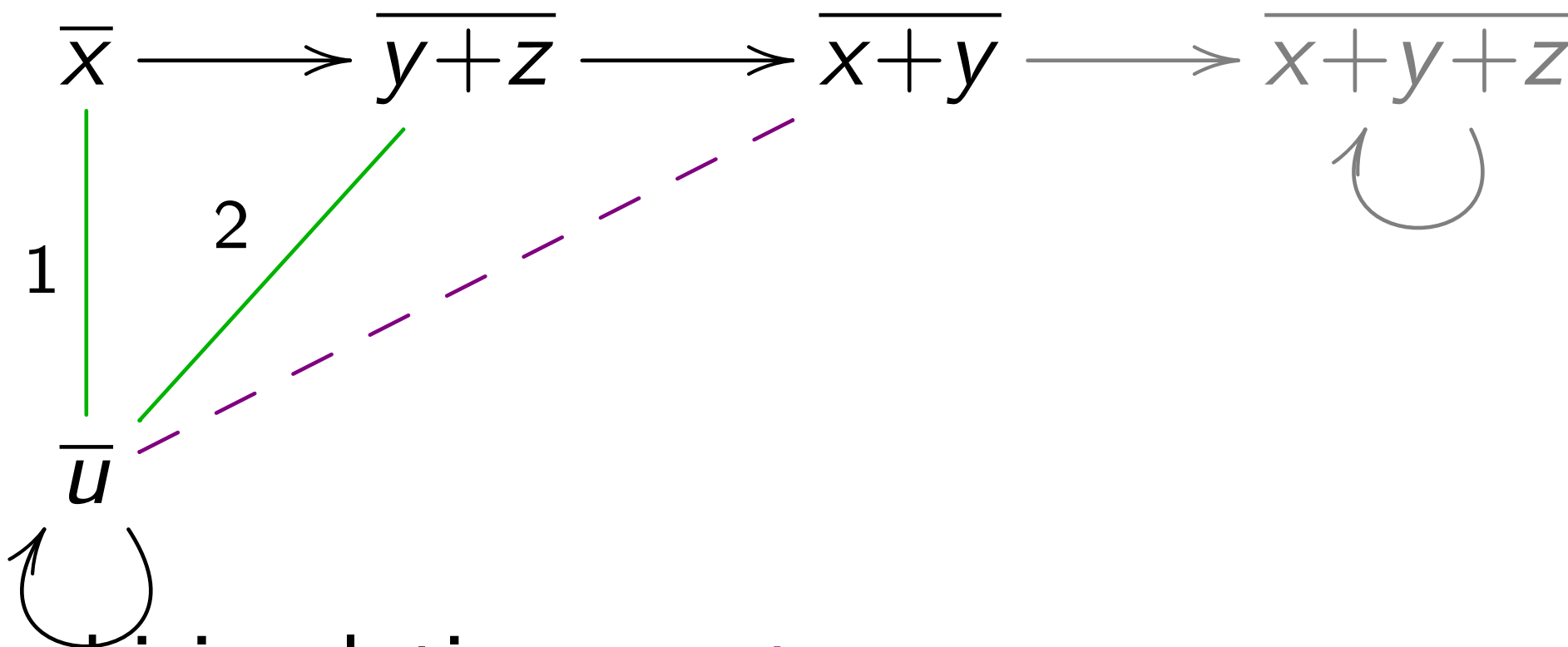


$$x+y = u+y \quad (1)$$

$$= y+z+y \quad (2)$$

$$= y+z$$

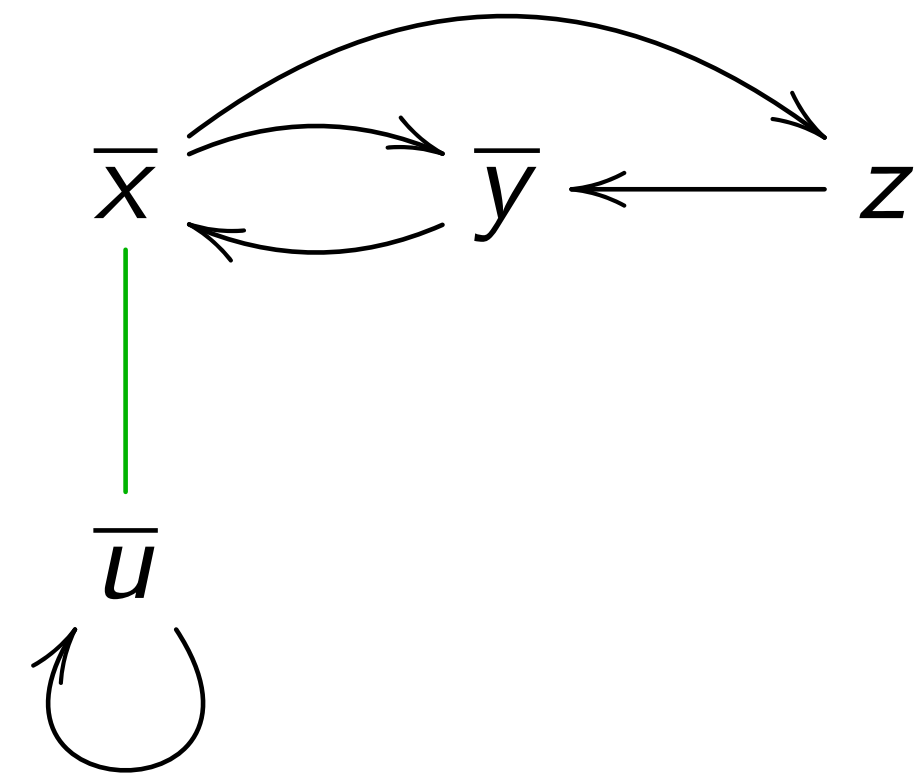
$$= u \quad (2)$$



using bisimulations **up to congruence**

Non-Deterministic Automata

One can do **even** better:

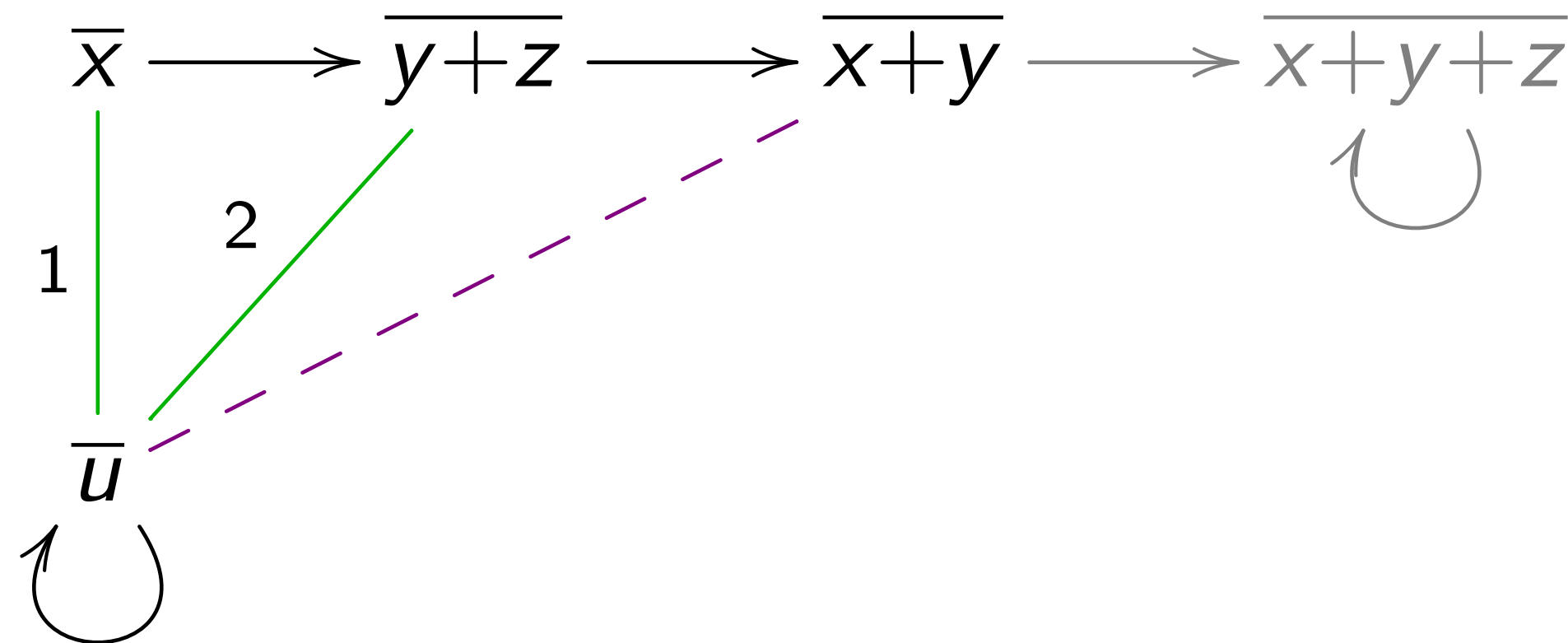


$$x+y = u+y \quad (1)$$

$$= y+z+y \quad (2)$$

$$= y+z$$

$$= u \quad (2)$$



this yield to the HKC algorithm [Bonchi, Pous'13]

Intermezzo: conduction up-to with coalgebra

Next time

Lecture 3

Equivalence via axioms
Completeness