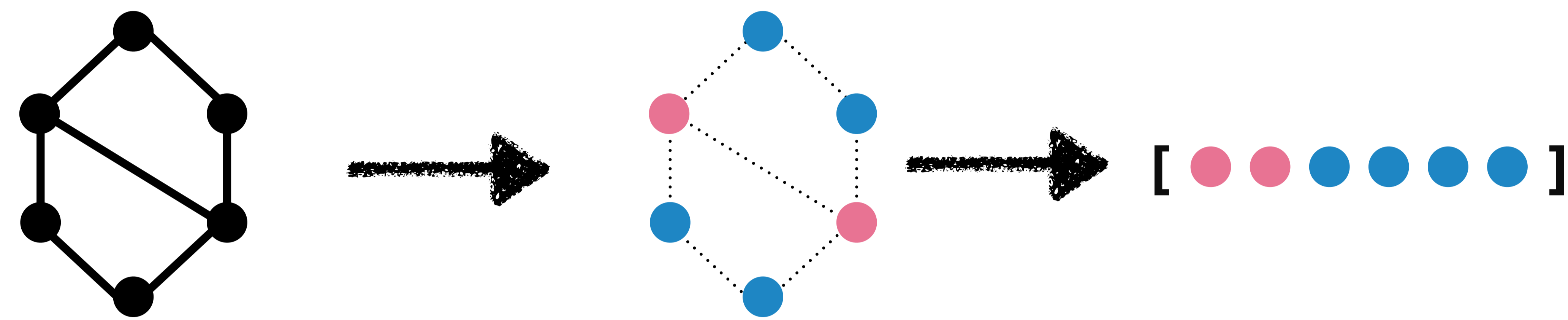
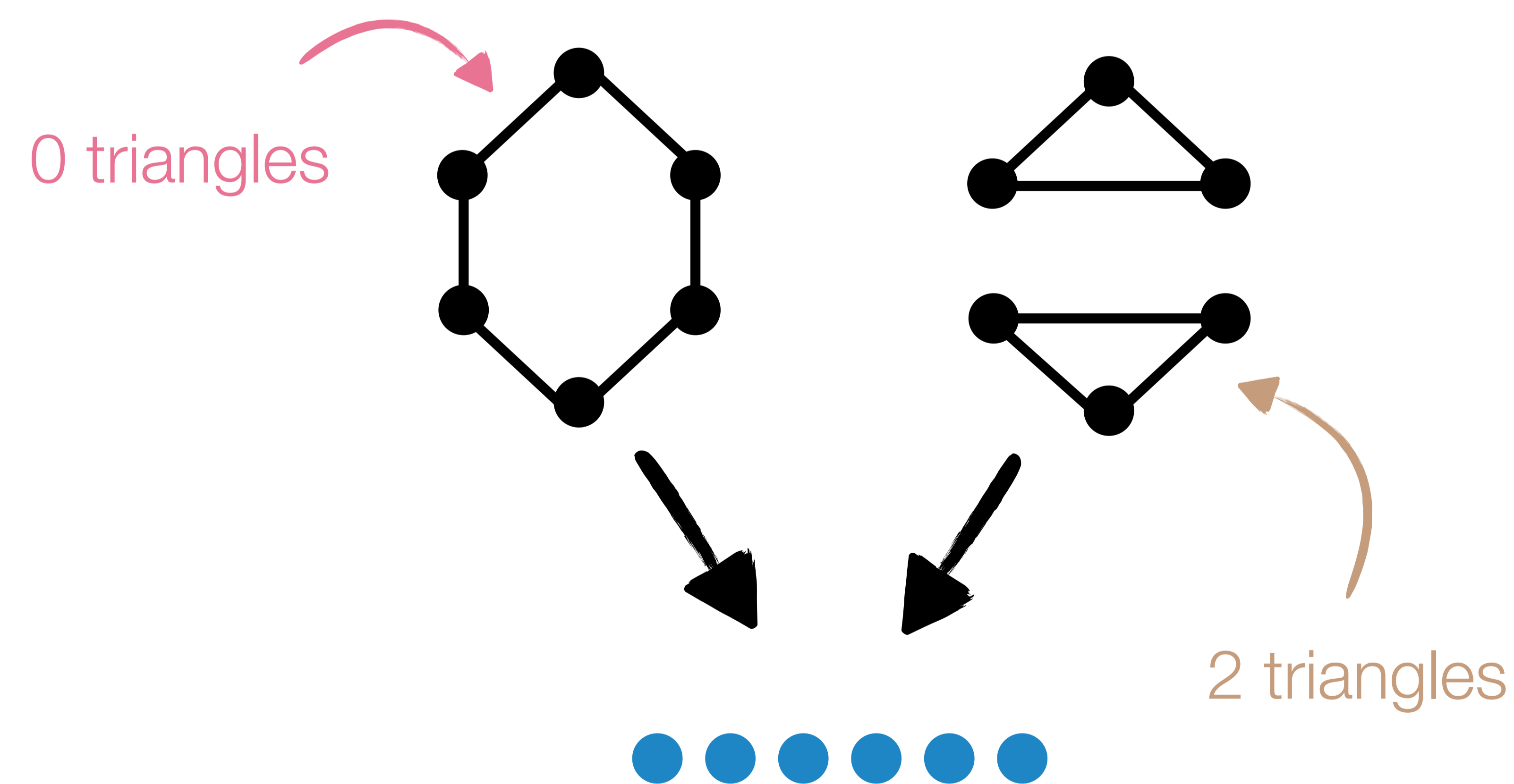


GNNs learn representations:



But there are graphs that always have  
the same representation!



A GNN can *express* function  $f$   
if whenever  $f(G) \neq f(H)$ , then  
 $G$  and  $H$  have different representations.

## When can a GNN express a function?

$\Gamma : \text{Graphs} \rightarrow \mathbb{Q}$  is a  
graph motif parameter (gmp)  
if it is of the form:

$$\Gamma(G) = \sum_{F \in \mathcal{F}_\Gamma} \alpha_F \cdot \text{homs}(F, G)$$

finite  $\mathcal{F}_\Gamma$ 
rational coefficients

Results A

For graphs with vertex and edge labels,  
 $k$ -WL can express gmp  $\Gamma$



maximum tree width in  $\mathcal{F}_\Gamma \leq k$

Includes e.g., all  
subgraph counting  
problems!

Results B

When a GNN can express gmp  $\Gamma$ ,  
then there is a uniform final layer that  
computes  $\Gamma$  from the  
individual node representations.

Results C

- ✦ When  $\Gamma =$  count occurrences of pattern  $P$ :  
Can find the precise  $k$  in polynomial time!
- ✦ Counting  $k$ -graphlets requires  $(k - 1)$ -WL