

The background features a light gray surface with several stylized human figures. One figure in the center is blue, while others are light gray. Four thick, curved arrows originate from the base of the blue figure: one blue arrow points up and to the left, one green arrow points up and to the right, one yellow arrow points right, and one orange arrow points down and to the left.

# On Parameterized Complexity of **Network Modifications** for **Binary Networked Public Goods Games**

B.Tech Project  
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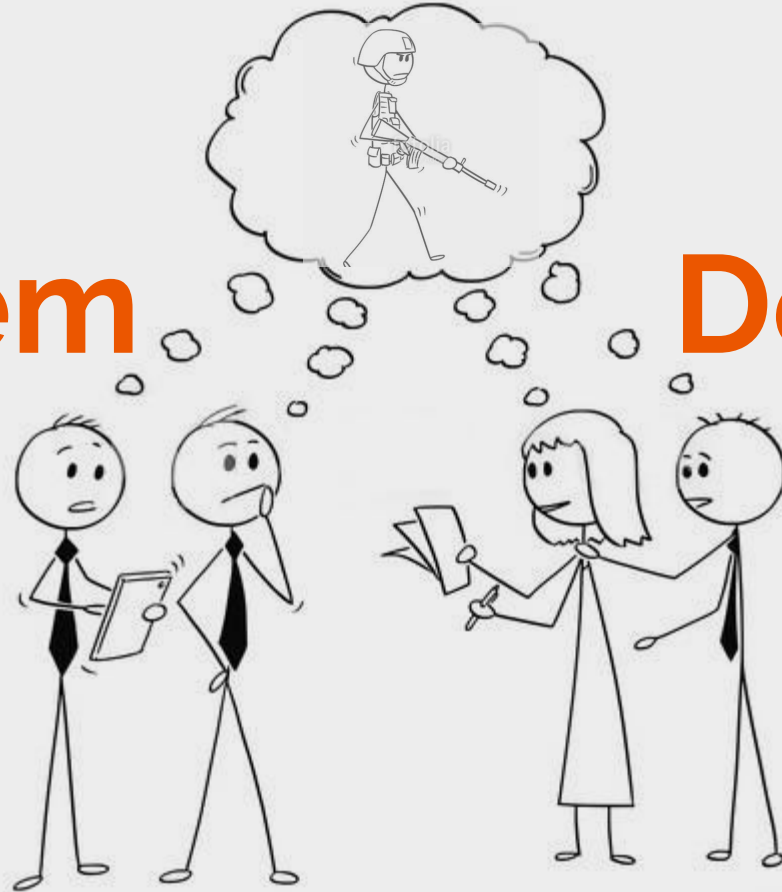
**NOT** continued from the work of BTP-1...





# Problem

# Definition



# BNPG (Binary Networked Public Goods) Games

Given:

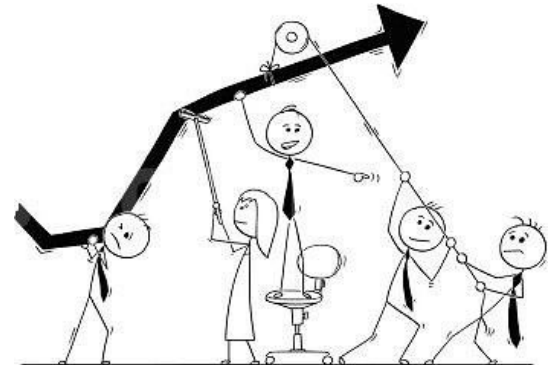
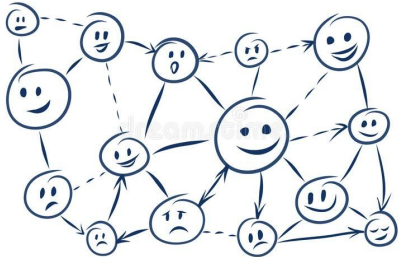
- Network as Undirected graph with players as vertices
- Each player  $i$  can either invest ( $x_i = 1$ ) or not ( $x_i = 0$ )
- Utility of  $i^{\text{th}}$  player :

$$U_i(x) = U_i(x_i, n_i^x) = g_i(x_i + n_i^x) - c_i x_i$$

where :

- $n_i^x := \# \text{neighbors investing}$
- $g_i(.) := \text{non - negative non - decreasing}$

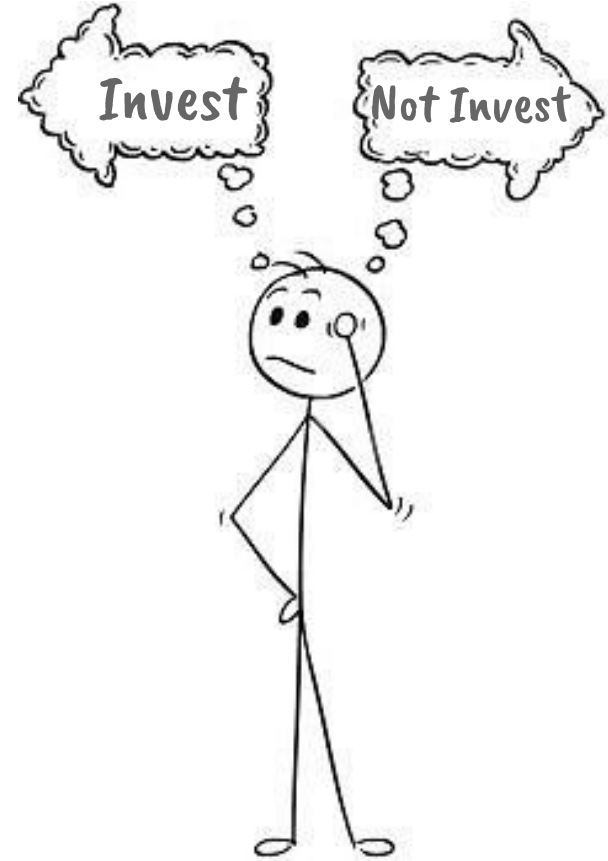
$x_i :=$  Strategy played by  $i^{\text{th}}$  player  
 $x = (x_1, \dots, x_n) :=$  Joint pure strategy profile of all players



# PSNE (Pure Strategy Nash Equilibria) of BNPG Games

A Joint Pure Strategy Profile  $x \in \{0, 1\}^n$  such that:

- $U_i(x_i, n_i^x) > U_i(1 - x_i, n_i^x)$ , or
- $U_i(x_i, n_i^x) = U_i(1 - x_i, n_i^x)$  and  $x_i = 1$



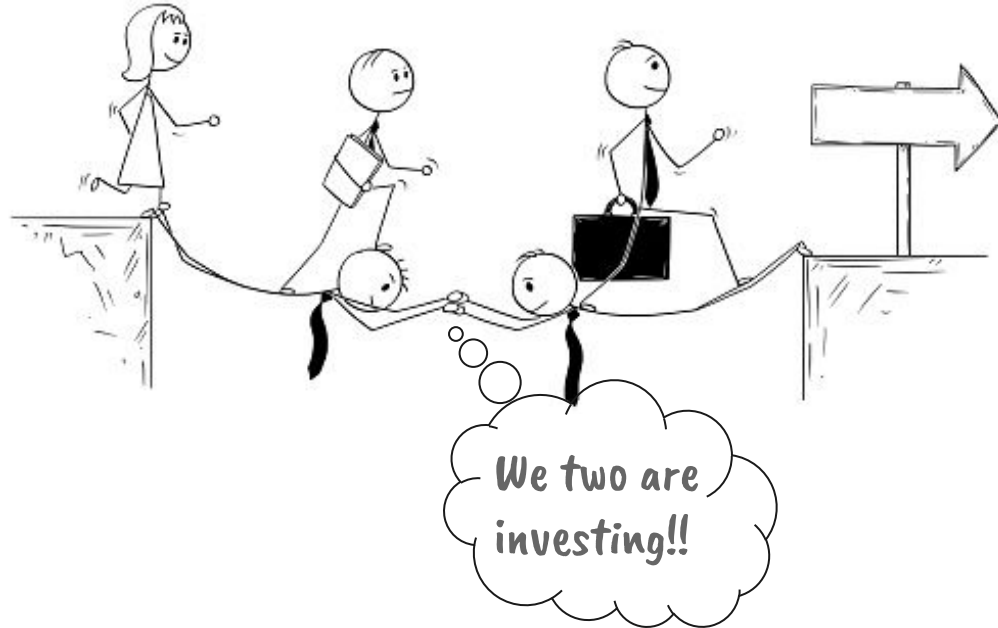
# Who Invests?? PSNE Classes

**all:** every player invests i.e.  $x = (1, 1, \dots, 1)$

**= S:** only set  $S$  invests

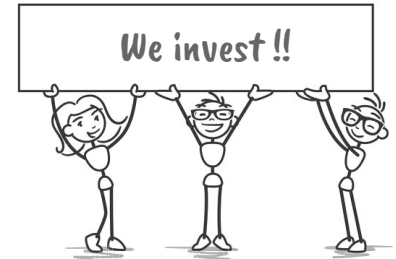
**$\supseteq$  S:** superset of set  $S$  invests

**$\geq r$ :** at least  $r$  players invest



# What's the **Problem** then???

- A few “**diligent**” workers may bear all the load
- Detrimental for a **long-term** perspective
- Turns out to be **unfair**



**Not ENOUGH  
to find PSNE  
of BNPG**



# Network Modifications : Tackling Unfairness

A central mechanism (algorithm) ensuring:



- A specified set of players invest
- **Break** existing connections (**delete edges**)
- **Make** new connections (**add edges**)
- **Bribe them!!!**

**Edge Edition!!**  
**Addition**  
**+**  
**Deletion**



## $g_i(\cdot)$ : what forms it can take?

- Captures how a player behaves w.r.t increasing investment of its neighbors
- Non – negative, Non – decreasing

Can be :

- general
- convex (increasing returns)
- concave (diminishing returns)
- sigmoid (first increasing then diminishing returns)



# Investment Degree Set ( $D_i$ )

A unique set  $D_i \subseteq \{0, 1, \dots, n-1\}$  such that:

- $x_i = 1$  is a best response  $\Leftrightarrow n_i^x \in D_i$

Interesting property:

- $g_i$  is concave  $\Leftrightarrow D_i$  is downward-closed interval
- $g_i$  is convex  $\Leftrightarrow D_i$  is upward-closed interval
- $g_i$  is sigmoid  $\Leftrightarrow D_i$  is an interval



# NDDS(P,X) (Network Design for Degree Sets)

## Given :

- BNPG instance  $\quad :=$  (Graph & utilities  $U_{i \in [n]}$ )
- $D_i$   $\quad :=$  investment degree sets for all players  $i \in [n]$
- $\gamma_{e \in E}$   $\quad :=$  Edge costs
- $X$   $\quad :=$  desired PSNE class (all,  $= S$ ,  $\supseteq S$ ,  $\geq r$ )
- $P$   $\quad :=$  Property of  $g_i(\cdot)$  (convex, concave, sigmoid, or general)
- $k$   $\quad :=$  budget  $k$

## Goal :

Decide whether there exists an edge set  $S$  with:

- $\sum_{e \in E \ominus S} \gamma_e \leq k$
- $\exists I \in X$  of investing players such that in the modified graph  $G' (V, E' = E \ominus S)$

$$\begin{aligned} |N_i^{G'} \cap I| &\in D_i & \forall i \in I \\ |N_i^{G'} \cap \bar{I}| &\notin D_i & \forall i \notin I. \end{aligned}$$

# No Budget !! (k=0)

$$Y_{e \in nC2} > 0$$

NDDS **reduces** to :

- Finding **PSNE** for BNPG
- **Without** any **modifications** allowed

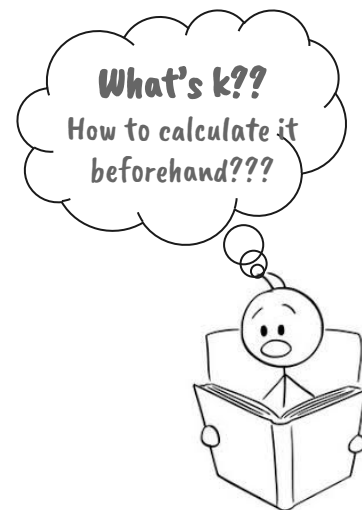
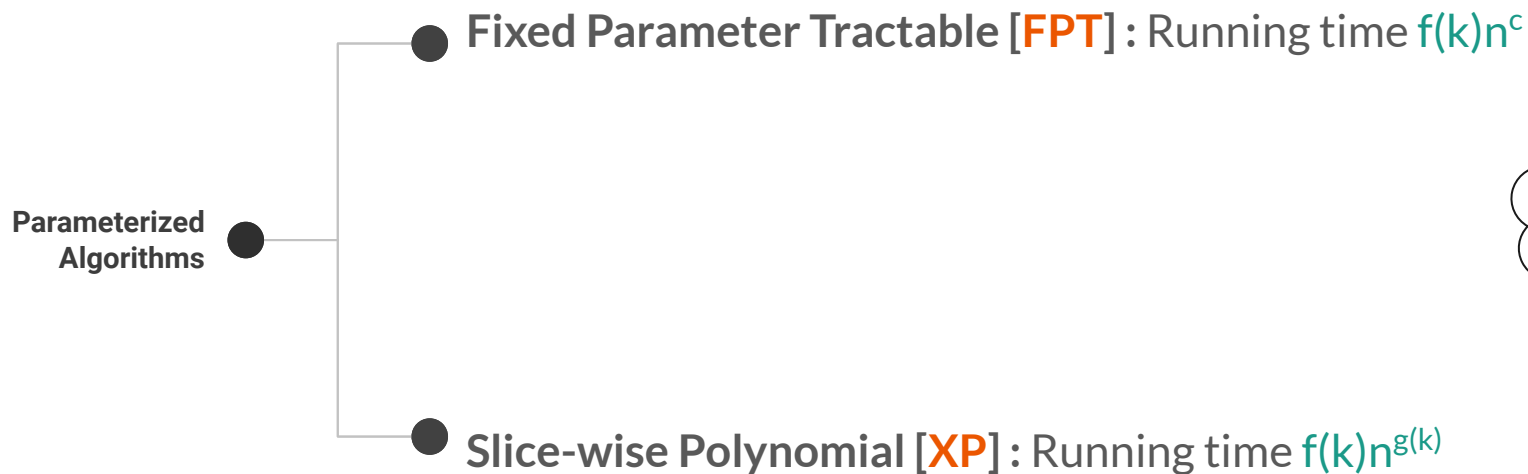




# Preliminaries

# Parameterized Algorithms

**Parameterized problem** : Language  $L \subseteq \Sigma^* \times \mathbb{N}$ , where  $\Sigma$  is a fixed, finite alphabet. For an instance  $(x, k) \in \Sigma^* \times \mathbb{N}$ ,  $k$  is called the **parameter**.



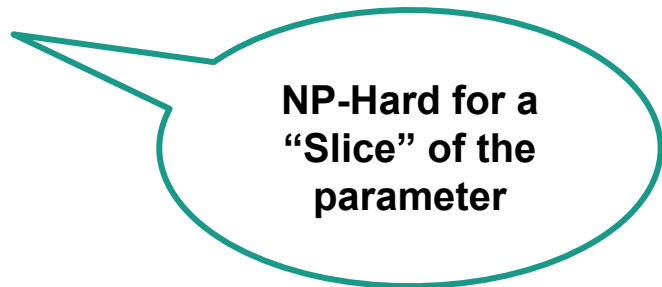
# Para-NP-Hardness

**Para-NP** [ Flum and Grohe]:

Class of parameterized problems solvable in time  $f(k) \cdot |x|^{O(1)}$  by a nondeterministic TM  
[f is computable]

**Para-NP-Hard** :

NP-Hard for a constant value of parameter





# W[t]-Hardness

W[t]

If there is a parameterized **reduction** from problem **P** to  $WCS[C_{t,d}]$  for some  $d > 1$

**W[t]-Hard :**

If every problem in  $W[t]$  can be reduced to **P**

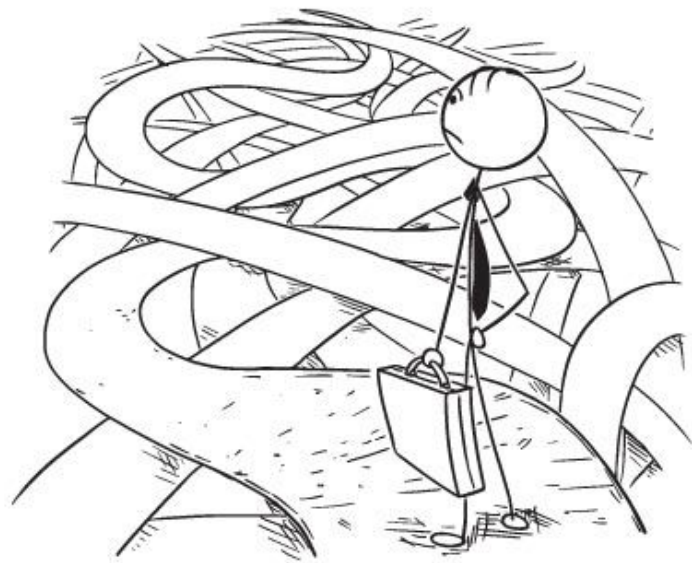
FPT

**WCS??**  
Weighted Circuit  
Satisfiability



# Parameters Under Consideration

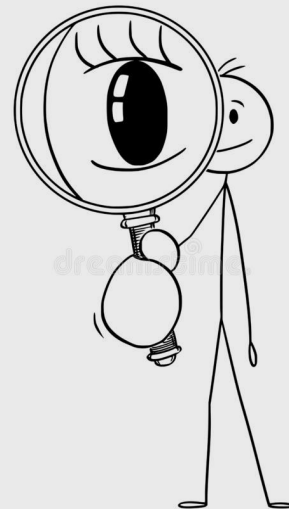
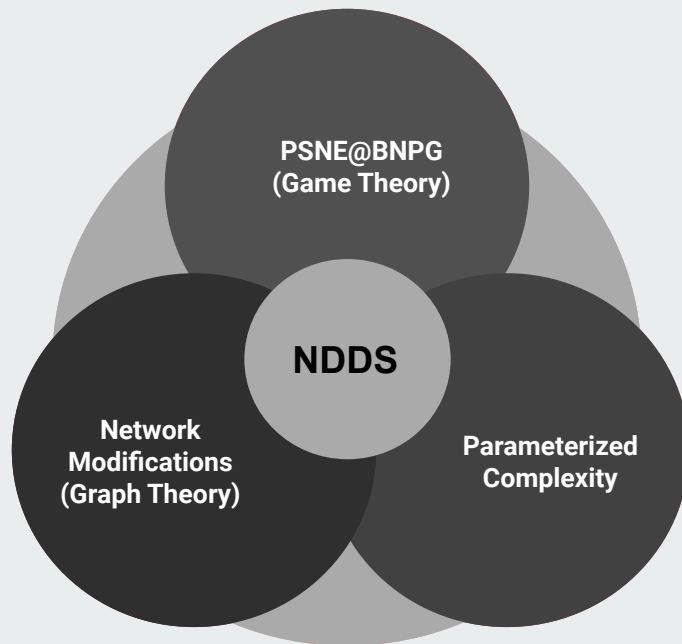
- $k$  := input budget
- $r$  := NDDS  $(P, r)$
- $\alpha$  :=  $\min_{v \in V[G]}$  lower bound( $D_v$ )
- $\delta$  := diameter of input graph
- $n_U$  := number of distinct utility functions
- $tw$  := treewidth of graph\*
- $D$  :=  $\max_{v \in V[G]} |D_v|$
- $\Delta$  := max degree of input graph



Skipping over the Prior Results ...

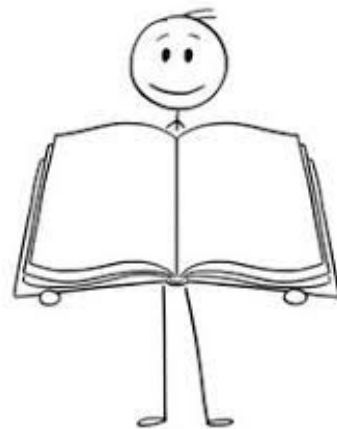


# Our Results

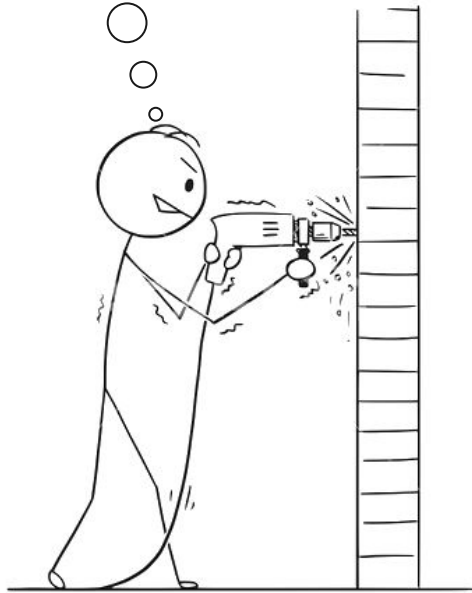


# Summary of Our Results

Problem Variant	Parameter	Result
all, general	$k$ (budget)	W[1]-Complete Theorem 15
$\{= S, \supseteq S, \geq r\}$ , general	$k$	W[1]-Complete Theorem 16
$\{\supseteq S, \geq r\}$ , concave	$k$	W[1]-Complete Theorem 17
$\{\supseteq S, \geq r\}$ , sigmoid	$k$	W[1]-Complete Theorem 18
$\geq r, \{\text{concave, convex, sigmoid}\}$	$r + k$	W[1]-Complete Theorem 19
$\geq r$ , convex	$k + r + \alpha$	W[1]-Hard Theorem 23
$\geq r$ , sigmoid	$r$	para-NP-hard Theorem 25
$\{\geq r, \supseteq S\}$ , general	$ I $	W[2]-Hard Observation 2
$\{\geq r, \supseteq S\}$ , general	$n -  I $	W[2]-Hard Observation 2
$\{\geq r, \supseteq S\}$ , general	treewidth	W[1]-Hard Observation 3
$\{\geq r, \supseteq S\}$ , general	$\Delta$	para-NP-hard Observation 4
$\{\geq r, \supseteq S\}$ , general	$(\delta, n_U)$	para-NP-hard Observation 6, Observation 5
$\{-\text{any}-, -\text{any}-\}$ , -any-	$k$	$n^{O(k)}$ XP algorithm Observation 7
$\{\geq r\}$ , convex	$r$	$n^{O(r^2)}$ XP algorithm Theorem 26



Meh! It  
is hard!!

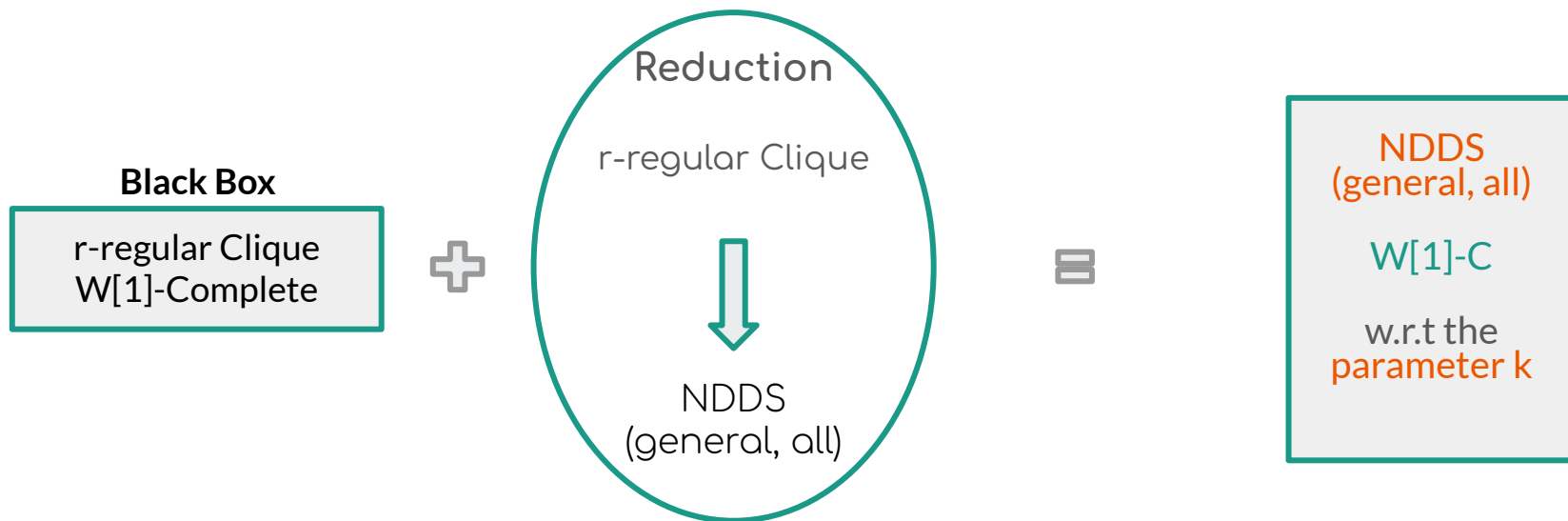


# Hardness Results

# Result1 : $\text{NDDS}(\text{general, all}) - \text{W}[1]\text{-C}_{\text{w.r.t } k}$

Thm. The problem of  $\text{NDDS}(\text{general, all})$  is  $\text{W}[1]\text{-Complete}$  w.r.t the parameter  $k$  (budget).

Even when the input graph is **unweighted**

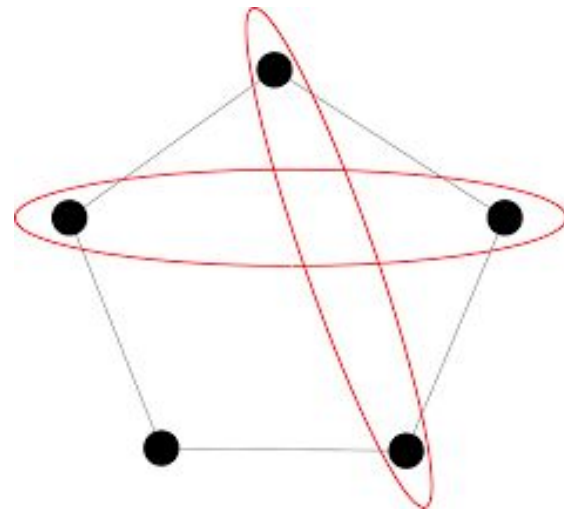


## r-regular Clique

**Input:**  $(G(V, E), k)$

➤  $G$  is  $r$ -regular undirected graph

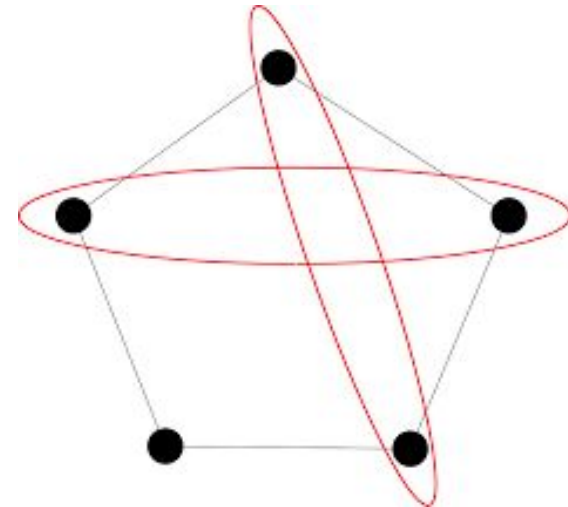
**Goal:** Decide whether there exists a  $k$ -clique as a subgraph of  $G$



# Main Reduction

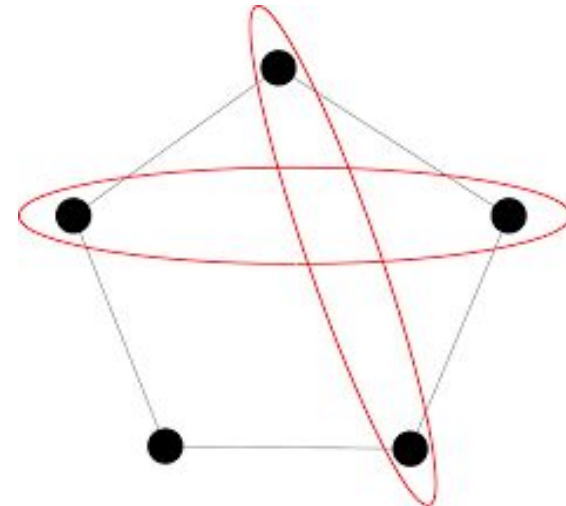


- ▷  $V'[G'] = V[G] \cup Z$ , where  $Z = \{z_1, \dots, z_k\}$ ;
- ▷  $E'[G'] = E[G] \cup \{(v_i, z_j) \mid \forall v_i \in V[G], j \in [k]\}$ ;
- ▷  $\gamma_e = 1, \forall e \in E'[G']$ ;
- ▷  $D_{v_i} = \{r - k - 1, r + k\}, \forall v_i \in V[G]$ ;
- ▷  $D_{z_j} = \{n - k\}, \forall j \in [k]$ ;
- ▷  $k' = k^2 + \binom{k}{2}$ .



## A Corollary...

- Set  $S = V[G]$  and  $r = n$  accordingly
- $\text{W}[1]$  – Completeness of
  - $\text{NDDS}(\text{general}, =S)$
  - $\text{NDDS}(\text{general}, \supseteq S)$
  - $\text{NDDS}(\text{general}, \geq r)$ 
    - with respect to the parameter  $k$ .

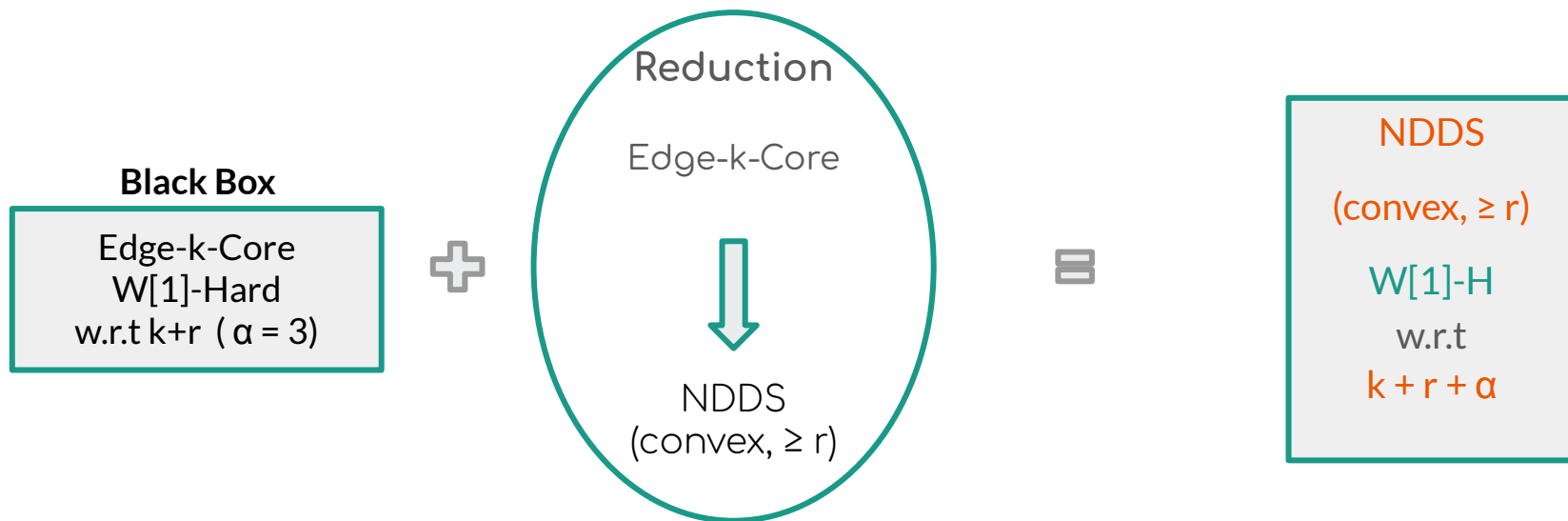




## Result2 : $\text{NDDS}(\text{convex}, \geq r)$ - $\text{W}[1]\text{-C}$ w.r.t $(k + r + \alpha)$

Thm.  $\text{NDDS}(\text{convex}, \geq r)$  is  $\text{W}[1]\text{-hard}$  with respect to the parameter  $k + r + \alpha$ .

$\text{W}[1]\text{-hard}$  w.r.t parameter  $k+r$  even when  $\alpha = 3$  even when the graph is **unweighted**.



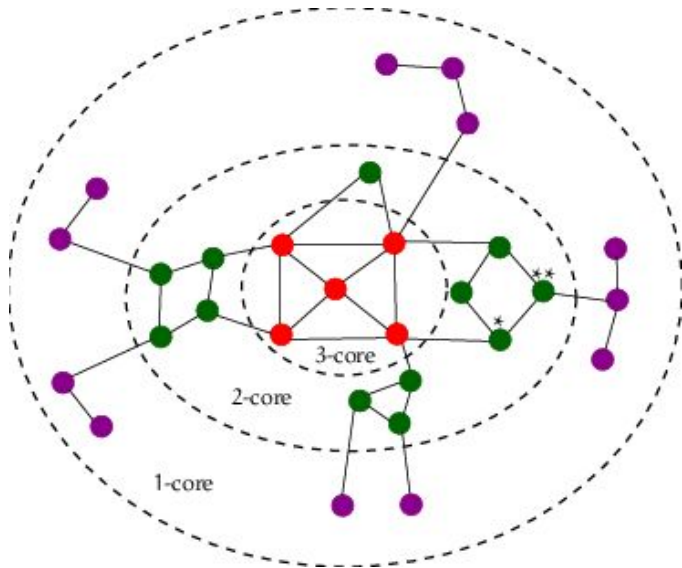
# Edge-k-Core

**Input:**  $(G(V, E), k)$

- Simple, undirected graph  $G = (V, E)$
- Integers  $k, \alpha$ , and  $r$

**Goal:** Decide if there exists  $H \subseteq V[G]$  such that:

- Adding at most  $k$  edges to  $G$
- In modified graph  $G'$ , every  $v \in H$  has  $\deg_{G'[H]}[v] \geq \alpha$



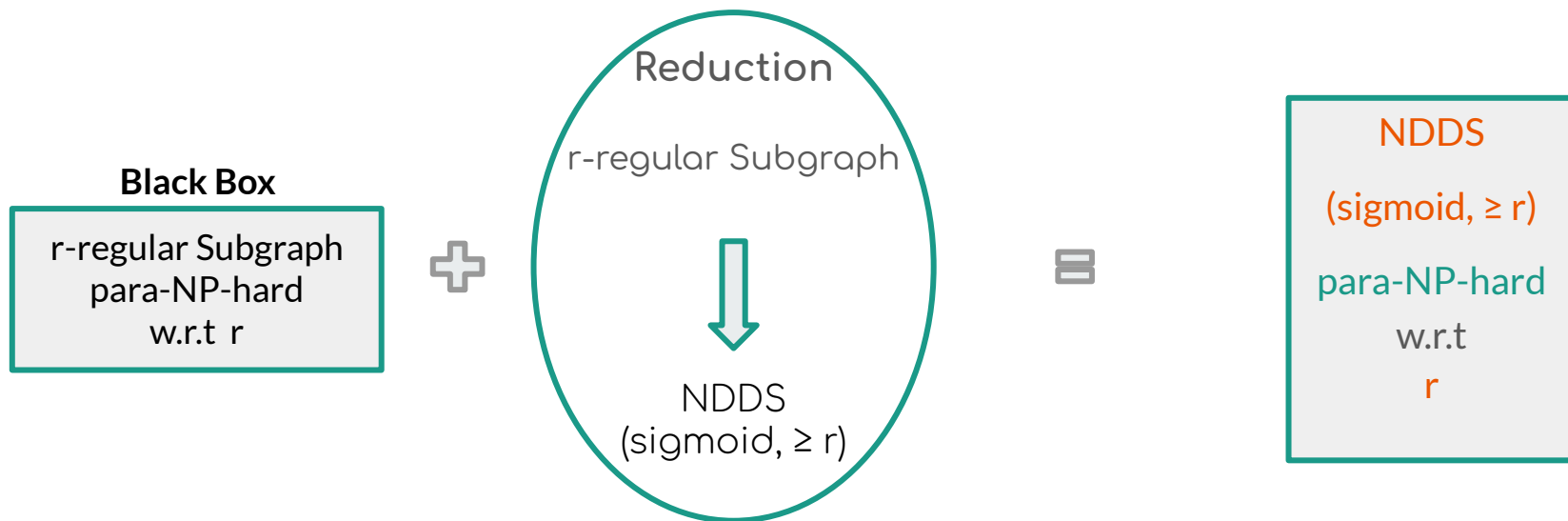
# Main Reduction

1.  $G^* = G$  i.e.  $V^* = V$  and  $E^* = E$ ;
2.  $D_v = \{\alpha, \dots, n-1\} \forall v \in V^*$ ;
3.  $r^* = r$
4.  $k^* = k$



## Result3 : NDDS (sigmoid, $\geq r$ ) - para-NP-hard w.r.t $r$

Thm. NDDS (sigmoid,  $\geq r$ ) is para-NP-hard w.r.t parameter  $r$   
even when  $\max(|D_v|) = 1$ ,  $k=0$ , and the graph is unweighted



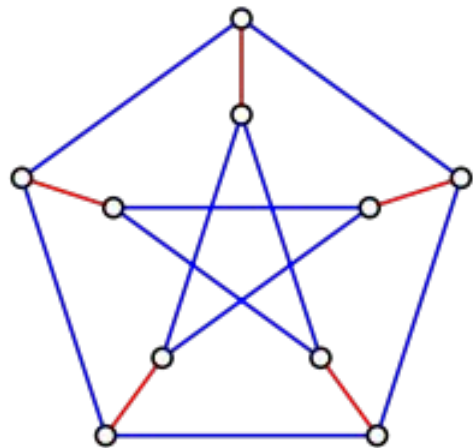
## r-regular Subgraph

**Input:**  $(G(V, E), r)$

- Simple, undirected graph  $G = (V, E)$
- Positive Integer  $r$

**Goal:** Decide whether there exists a  $H \subseteq V[G]$ , such that-

- Subgraph  $G[H]$  is  $r$ -regular



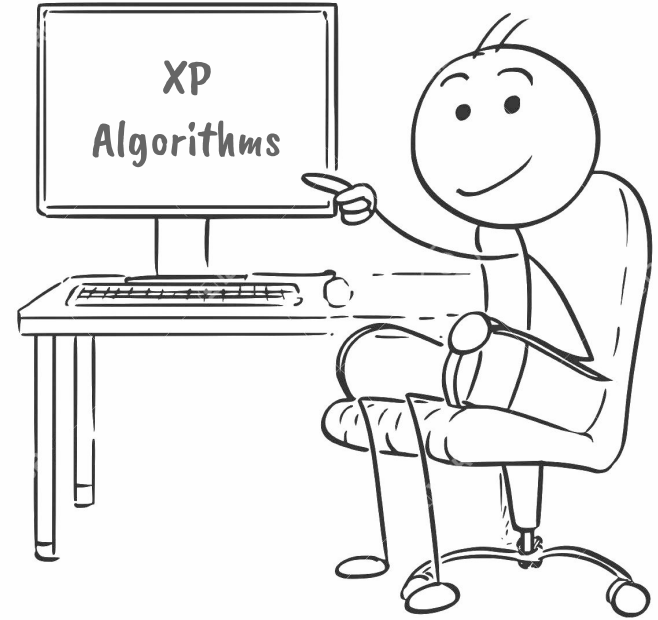
# Idea of Reduction



1.  $G^* = G$  i.e.  $V^* = V$  and  $E^* = E$ ;
2.  $D_v = \{r\} \forall v \in V^*$ ;
3.  $r^* = r$
4.  $k^* = 0$
5. weight of each edge = 1.



# Algorithmic Results



## Result4 : XP w.r.t k

Thm.

All versions of NDDS can be solved in XP time  $n^{O(k)}$

We already:

- Established W[1]-Completeness results w.r.t k
- Ruling out any FPT-Algorithm
- Designed the next best : XP

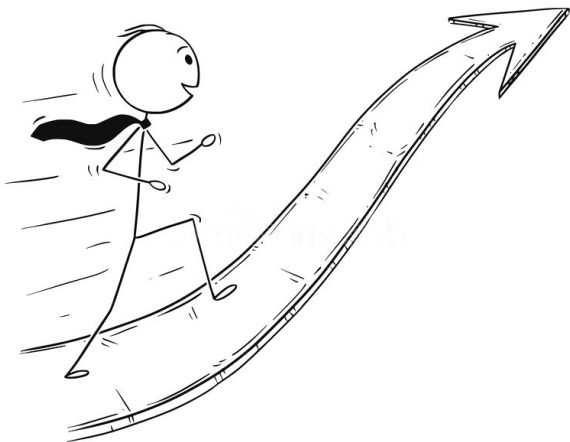




## Result6 : NDDS (concave, $\geq r$ ) - XP w.r.t $r$

Thm.

NDDS (convex,  $\geq r$ ) can be solved in XP time  $n^{O(r \cdot r)}$ .

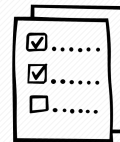


We already:

- Established W[1]-Completeness results w.r.t  $r$
- Ruling out any FPT-Algorithm
- Designed the next best : XP

# Conclusions & Significance of Our Work

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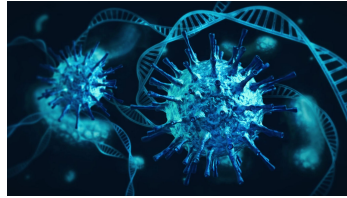
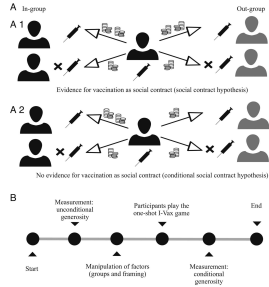
- Notched up the results taking into account the parameterized complexity w.r.t key natural as well as structural parameters
- Crucial role in computer science, economics, game theory and network design
- Lower Bound by  $W[1]$ -hardness
- Ruling out FPT
- Upper bound by XP-algorithms, making the analysis complete

# Future Directions

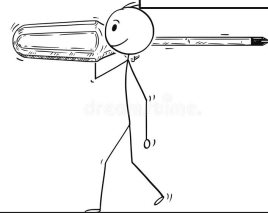


- Approximate, i.e.,  $\epsilon$ -PSNE for the problem...
- More structural parameters like VC, FVS, FAS...
- Problem formulation on line-graph of the input graph...
- XP algorithms w.r.t treewidth or maximum degree...
- Trivial graph classes like trees/forests, cycles, paths, caterpillars...
- Color coding
- Parameterization by distance to trees, paths or cluster graphs...

# Practical Implications

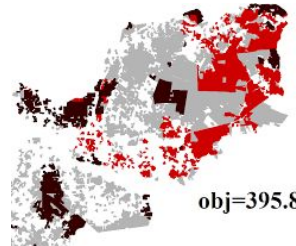


- Modeling **Behavioral Response to Vaccination** Using Public Goods Game by *Ben-Arieh et al.*
- Vaccination as a **Social Contract** by *Korn et al.*



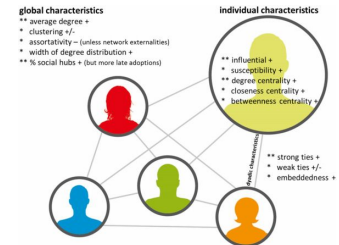
Game Theory of **Social Distancing** in Response to an Epidemic by *Rulega*

**Election Control** in Social Networks using **Edge edition** by *Castiglioni et al.*



Maximizing **spread of cascades** using **Network Design** by *Sheldon et al.*

Manipulating **opinion diffusion** in **social networks** by *Bredereck et al.*





**Q&A**

**Presenter**

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Thanks to:  
Aay  
StickMIT, Stickassachusetts

## Result4 : NDDS (concave, $\{\supseteq S, \geq r\}$ ) - $W[1]$ -C w.r.t $k$

Thm. NDDS (concave,  $X$ ) for  $X \in \{\supseteq S, \geq r\}$  is  $W[1]$  - Complete w.r.t the parameter  $k$ .

