### I. Introduction to NP Functions and Local Search

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### NP Functions — TFNP

[JPY'88, Papadimitriou'94].

#### Definition

TFNP, the class of Total NP Functions is the set of polynomial time relations R(x, y) such that R(x, y) implies  $|y| = |x|^{O(1)}$  and such that R is *total*, i.e., for all x, there exists y s.t. R(x, y).

**Thm.** If TFNP problems are in P, then  $NP \cap coNP = P$ .

**Pf.** If 
$$(\exists y \leq s)A(x,y) \leftrightarrow (\forall y \leq t)B(x,y)$$
 is in NP  $\cap$  coNP, then  $A(x,y) \vee \neg B(x,y)$  defines a TFNP predicate.  $\square$ 

Thus, any  $NP \cap coNP$  predicate gives a TFNP problem.



## Examples of TFNP problems

**Prime factorization:** Using Pratt's polynomial size certificates for primes, the predicate

$$R(x,y) := "y \text{ is a prime factorization of } x"$$

is in TFNP.

**Local Optimization:** Any local optimization problem with polytime checkable condition

$$R(x,y) := "y \text{ is a local optimum for instance } x"$$

is in TFNP. Examples include Dantzig's algorithm for linear programming, Lin-Kernighan for Traveling Salesman, Kernighan-Lin for graph partition, etc.



**Def'n:**  $[n] = \{0, 1, \dots, n-1\}.$ 

**Pigeonhole principle.** PHP<sub>n</sub><sup>n+1</sup>. If f is a mapping from [N] to [N-1], then there is some  $y = \langle i, j \rangle$ , i < j such that f(i) = f(j).

**Graph properties.** If G is a graph, all vertices of degree  $\leq 2$ , and node 0 has degree 1, then there is another node y with degree 1. Input: Function f specifying G; for each vertex s, f(s) gives the edges incident to s. Solution:  $y \neq 0$  of degree 1.

LEAF: Undirected graph, vertex 0 degree 1, all other nodes degree  $\leq$  2. Solution: Another node of degree 1.

SINK.OR.SOURCE: Directed graph, node 0 indegree 0, outdegree 1. All indegrees and outdegrees  $\leq$  1. Solution: another node with indegree or outdegree zero.

SINK: Same as SINK.OR.SOURCE, but solution is a node with outdegree 0.



# Polynomial Local Search (PLS)

Inspired by Dantzig's algorithm and other local search algorithms:

### Definition (JPY'88.)

A PLS problem consists of polynomial time functions: N(x,s), i(x), and c(x,s), polynomial time predicate F(x,s), and polynomial bound b(x) such that

- 0.  $\forall x (F(x,s) \rightarrow s \leq b(x))$ .
- 1.  $\forall x (F(x, i(x)))$ .
- 2.  $\forall x(N(x,s) = s \lor c(x,N(x,s)) < c(x,s)).$
- 3.  $\forall x (F(x,s) \rightarrow F(x,N(x,s)))$ .

A solution is a point s such that F(x, s) and N(x, s) = s.

Thus, a solution is a local minimum. Clearly, a  $\operatorname{PLS}$  problem is in  $\operatorname{TFNP}.$ 



## Reductions among TFNP problems

**Definition:** Let R(x,y) and Q(x,y) be TFNP problems. A polynomial time many-one reduction from R to Q (denoted  $R \leq Q$ ) is a pair of polynomial time functions f(x) and g(x,y) so that, for all x, if y is a solution to Q(f(x),y), then g(x,y) is a solution to R, namely R(x,g(x,y)).

A polynomial time, Turing reduction,  $R \preccurlyeq_{\mathcal{T}} Q$  is a polynomial time Turing machine that solves R making (multiple) invocations of Q. It must succeed no matter which solutions y are returned in response to its queries Q(-,-).

## A PLS-complete circuit problem.

#### Definition

A instance of FLIP is a Boolean circuit, m inputs and n outputs interpreted as n-bit integer. The feasible points s are m-bit inputs. Cost c(s) is the integer output. Neighbors of s are the m points at Hamming distance one. N(s) = any neighbor of lower cost.

**Thm:** [JPY'88] FLIP is many-one complete for PLS.

**Thm:** [JPY'88] The Kernighan-Lin problem for minimum weight graph partitioning (LOKL) is many-one complete for PLS.



# Relativized (type 2) TFNP problems

#### Definition

A relativized or Type 2 TFNP problem  $R(1^n, f, y)$  is a (oracle) polynomial time predicate that takes as input a size bound  $1^n$  and one or more functions  $f: [2^n] \to [2^n]$ . A solution is any value such that  $R(1^n, f, y)$ .

**Definition:** A many-one reduction from R to Q is a triple of oracle polynomial time functions:

- a mapping  $1^n \mapsto 1^m$ , that is computing m = m(n).
- a function  $\beta^f:[2^m]\to[2^m]$ ,
- a function  $\gamma^f$  such that if y is a solution to  $Q(1^m, \beta^f, y)$ , then  $\gamma^f$  computes a solution to  $R(1^n, f, \gamma^f(1^n, y))$ .

In many cases, the first function does not need to make oracle calls, and we henceforth assume this is the case.



## Some subclasses of TFNP [P'94, BCEIP'98]

Class	$\preccurlyeq_{\mathcal{T}}$ -Complete problem
PPA	Leaf
PPAD	SINK.OR.SOURCE
PPADS	Sink
PPP	$PHP_n^{n+1}$

### Theorem (BCEIP'98)

In the relativized (oracle) setting, we have:

 $PPAD \subset PPADS \subset PPP$  and

 $PPAD \subset PPA$ 

Furthermore, no other inclusions hold.



### Theorem (Morioka)

In relativized setting, PPAD  $\not \leq_T$  PLS. The same holds for PPADS, PPP, PPA in place of PPAD.

**Proof:** (By contradiction.) Let M be an oracle Turing machine that reduces instances  $\langle \alpha, n \rangle$  of Sink.or.Source to a PLS problem.  $\alpha$  is to specify an undirected graph G on [n]. W.l.o.g.,  $\alpha$  is a function  $\alpha(i) = \langle j, k \rangle$  meaning that the only edge into i is from j, and the only edge out from i is to k. The goal is find that node 0 has degree  $\neq 1$ , or to find another node with degree 1, or to find an inconsistency in  $\alpha$ 's specification of the undirected graph G.

M can query  $\alpha$  and can invoke PLS problems P with inputs  $\beta, x$  where  $\beta$  is a code for a polynomial-time (fixed time bound) Turing machine  $M^*$  that can query the oracle  $\alpha$  and that computes values of the F, i, N, and c for the queried instance P of PLS. Any such query by M returns a solution to P.

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In the end, only polynomially many edges will have been specified. This suffices to obtain a contradiction, since M will have no way of outputting a node that must have in- or out-degree 0.

Each time M queries  $\alpha$ , set its value arbitrarily so as to maintain goodness. When a PLS problem P is invoked: find a least cost value  $c_0$  such that some feasible point  $x_0$  has cost  $c_0$  when computed using some good (polynomial size) extension of  $\alpha$ . Set  $\alpha$  accordingly. Then arbitrarily extend  $\alpha$  further to a good partial graph that sets enough values of  $\alpha$  to allow the values of  $\alpha$ ,  $\alpha$  and  $\alpha$  at  $\alpha$  to be computed. Q.E.D.

On the other hand, we have:

### Theorem (Buresh-Oppenheim, Morioka '04)

 $PLS \not\preccurlyeq PPA$ .

Hence  $PLS \not\preccurlyeq PPAD$ .

**Open question:** Does  $PLS \leq PPADS$  hold?

This is known not to hold with a "nice" (=parsimonious) reduction.

#### More classes

- 1.  $\alpha$ -PLS, for  $\alpha$  an ordinal  $\epsilon_0$  or  $\Gamma_0$ . PLS is modified so that costs are notations for ordinals  $< \alpha$ . [Beckmann-Buss-Pollett'02].
- 2. Colored PLS [Krajíček-Skelley-Thapen'07]
- 3. RAMSEY. Input: an undirected graph G on N nodes. Output: a homogeneous set of size  $\frac{1}{2} \log N$ .
- 4. Weak PHP,  $PHP_n^{2n}$ , etc.

**Thm:**  $\alpha$ -PLS is many-one equivalent to PLS for  $\alpha = \epsilon_0$  and  $\alpha = \Gamma_0$ . [BBP'02]

**Thm:** Colored PLS is strictly stronger than PLS. [KST'07]

**Question:** What is the strength of RAMSEY? Of  $PHP_n^{2n}$ ?

Question: What is the strength of FACTORING? [P'94]



# First-order representations for search problems.

#### Definition

A first-order, existential formula  $\phi$ , interpreted in finite structures [N], defines a TFNP-problem, provided  $\phi$  is valid in all finite structures.

#### **Examples:**

PHP: 
$$(\exists x)(\exists y)(f(x) = 0 \lor (x \neq y \land f(x) = f(y)))$$

ontoPHP:

$$(\exists x)(\exists y)(f(g(x)) \neq x \lor f(x) = 0 \lor (x \neq y \land f(x) = f(y)))$$



## Translations to propositional logic [Wilkie-Paris]

To translate  $\exists \vec{x} \phi$  to a family of propositional formulas. First write  $\phi$  as a DNF in which no functions are nested, w.l.o.g. For each N>0, translate as the following family of formulas using variables  $p_{i,j}$  for f(i)=j,  $q_{i,j}$  for  $g_{i,j}$ , etc.

- (a) Function totality.  $\bigvee_{j \in [N]} p_{i,j}$  (for each  $i \in [N]$ , each f).
  - Functionality.  $\overline{p_{i,j}} \vee \overline{p_{i,k}}$ , for each i, each  $j \neq k$ .
- (b) For assignment of values to  $\vec{x}$  from [N], each disjunct of  $\phi$  becomes a conjunction of atoms.
- Propositional translation is sequent:  $(a) \rightarrow (b)$ .

More commonly, we wish to a refutation system.  $\neg \exists \vec{x} \phi$  becomes an (unsatisfiable) set  $\Gamma_{\phi}$  of clauses: namely, clauses (a), and the clauses which are the negations of conjunctions (b).



**Example:** The Paris-Wilkie translation of  $PHP_{N-1}^N$  is  $\Gamma_{PHP}$  containing the clauses

$$\bigvee_{j} p_{i,j},$$
 for all  $i = 0, ..., N - 1$ .  
 $\neg p_{i,j} \lor \neg p_{i,k},$  for all  $j \ne k$ , all  $i$ .  
 $\neg p_{i,0},$  for all  $i = 0, ..., N - 1$ .  
 $\neg p_{i,j} \lor \neg p_{i',j},$  for all  $i \ne i'$ , all  $j$ .

Since  $\Gamma_{PHP}$  is unsatisfiable, it has a refutation. Let the depth of a formula be the maximum nesting of (blocks of)  $\land$ 's and  $\lor$ 's in the formula. The *depth* of a proof is the max depth of any formula in the proof. It is a now-classic theorem that  $\Gamma_{PHP}$  requires exponential size to refute with bounded depth propositional proofs [BIKPPW].



#### Definition

 $\Gamma_R \leq_{bdLK} \Gamma_Q$  provided there are quasipolynomial size, bounded depth propositional proofs, from  $\Gamma_R$ , of each 'clause' of some substitution instance of  $\Gamma_Q$ .

### Theorem (B-O,M)

If  $R \leq Q$ , then  $\Gamma_R \leq_{bdLK} \Gamma_Q$ .

They also prove a similar result about reducibility with respect to Nullstellensatz proofs,  $\leq_{HN(d)}$ , via constant degree d reductions.

As corollaries, one gets nearly all known independence results for  $\preccurlyeq$ -reductions among TFNP.



## Theorem (B-O&M)

If  $R \leq Q$ , then  $\Gamma_R \leq_{bdLK} \Gamma_Q$ .

**Proof.** (Sketch.) Let  $R = R(f, 1^n)$  and  $Q = (g, 1^m)$ . The  $\leq$  reduction gives m = m(n) and gives a polynomial time oracle machine  $M^*$  computing g(i),  $i \in [2^m]$ . An execution of  $M^*$  on input i can be viewed as a polynomial depth decision tree  $T_i$ . Each node in  $T_i$  queries some value  $j \in dom(f)$  and branches  $2^n$  ways to give the value of  $f(j) = \ell$  — this branch is labeled with  $p_{j,\ell}$ . Each leaf of  $T_i$  has a label k, indicating g(i) = k.

Identify paths in  $T_i$  with the conjunction of literals  $p_{i,\ell}$  on the path. Define the condition g(i) = k as the disjunction over the paths in  $T_i$  that end with label k.

The DNF formulas for g(i) = k give the substitution instance of  $\Gamma_Q$ .



#### Proof cont'd.

The instances of the functionality and totality clauses of  $\Gamma_Q$  follow readily from those of  $\Gamma_R$ .

Consider some other clause C in  $\Gamma_Q$ . If (the instance of) C falsified by some values of g, then the  $\preccurlyeq$  reduction runs a further oracle polynomial time procedure to find a clause of  $\Gamma_R$  that is falsified. Form a decision by cascading, (a) decision trees for the values of g needed for falsifying C, and (b) for the paths that falsify C, append the decision tree of queries made by the subsequent oracle polynomial time procedure,  $\gamma$ .

Each path in this big decision tree that falsifies C also contains an explicit falsification of some clause in  $\Gamma_R$ .



The first-order framework does not apply directly to all natural TFNP problems. For example, RAMSEY would be formulated as

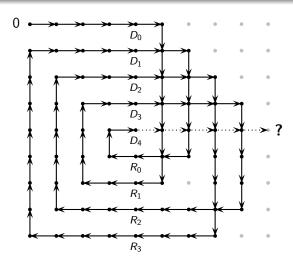
$$\exists \langle x_0, \ldots, x_{\frac{1}{2}|N|} \rangle \forall i, j, k \in [\frac{1}{2}|N|].i \notin \{j, k\} \to (e(x_i, x_j) \leftrightarrow e(x_i, x_k))$$

The second quantifier is a kind of "sharply bounded" quantifier of the type used in bounded arithmetic, with  $|N| \approx \log N$ .

It is also possible to consider higher-level reductions between TFNP problems than  $\preccurlyeq$ - and  $\preccurlyeq$ -reductions. Consider, for example, the reduction shown on the next page from  $PHP_{N-1}^N$  to the SINK principle.

For  $\mathrm{PHP}_{N-1}^N$  it is a bounded depth reduction (in terms of definability in bounded arithmetic). Only for  $\mathrm{ontoPHP}_{N-1}^N$  is it a  $\preccurlyeq$ -reduction.





How to build an instance of SINK from an instance of  $PHP_4^5$ . The dotted path from  $D_4$  would connect back up to a  $R_i$  point if we had a contradiction to the pigeonhole principle.

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