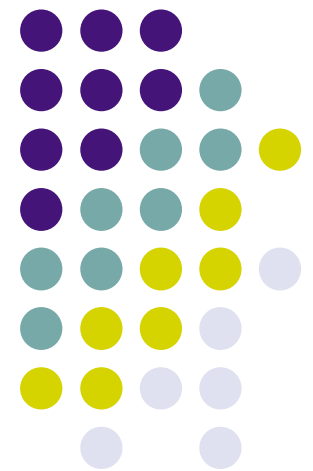


Complexity Classes VIII

Stronger Approximation Bounds

Eric Rachlin

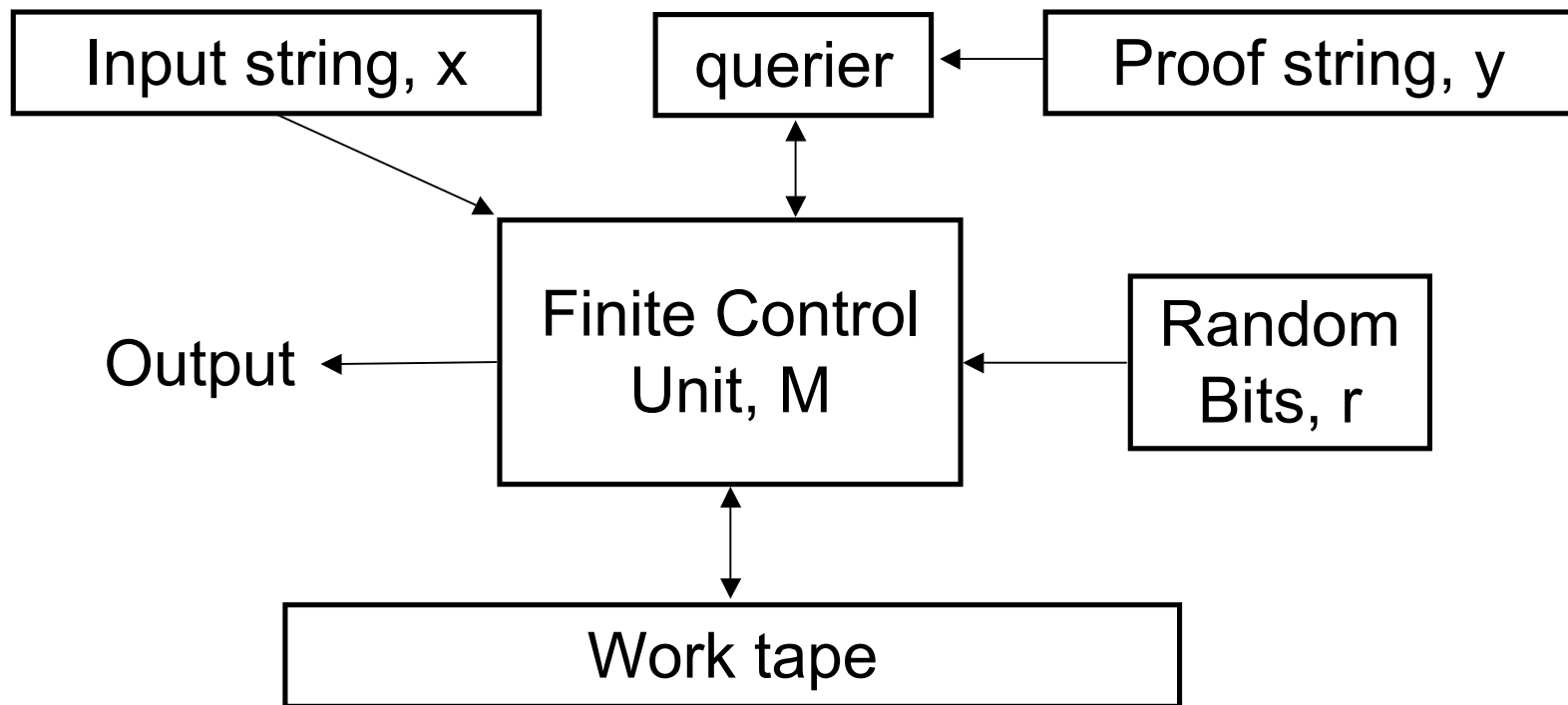
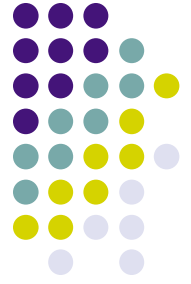




Review of PCP

- $\text{PCP}_{c, s}[q(n), r(n)]$ is the class of languages that can be recognized with by some Turing machine (which we call a “verifier”) with soundness s (or less) and completeness c (or more) using $O(r(n))$ random bits and $O(q(n))$ queries to a proof.
 - Completeness c means that there exists a proof such that strings in L are accepted with probability c .
 - Soundness s means that for all proofs the TM accepts strings not in L with probability s .

PCP Verifiers





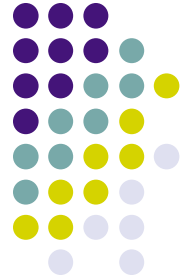
The PCP Theorem

- PCP Theorem: $NP = PCP_{1, 1/2} [1, \log(n)]$.
 - which implies $NP = PCP_{1, 1/n} [\log(n), \log(n)]$.
- By representing the behavior of a verifier as an instance of 3SAT, we saw that a PTAS for 3SAT implied $P = NP$.
- By representing the behavior of a verifier as an instance of clique, we were able to show a constant factor approximation for CLIQUE implied $P = NP$.
- In both cases, our results were functions of q , the number of queries required to verify some NP-complete language.

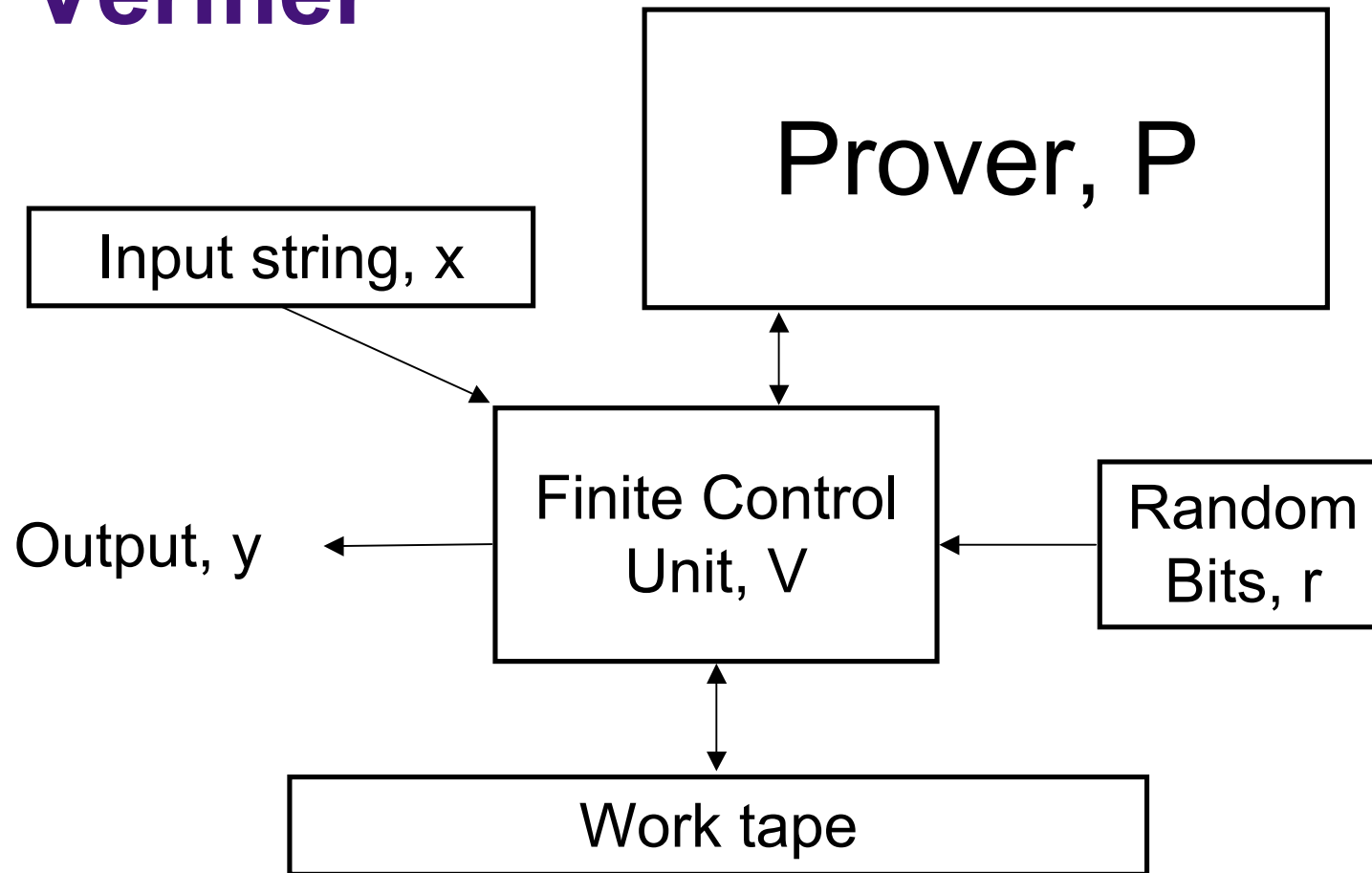
IP



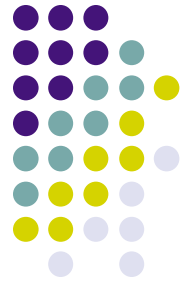
- IP is the class of languages “recognized” by a polynomial rounds of randomized interaction:
 - $q_1 = V(x, r_1)$
 - $a_1 = P(x, q_1)$
 - ...
 - $a_{\text{poly}(|x|)} = P(x, q_1, a_1, \dots, q_{k-1}, a_{k-1}, q_k)$
 - $y = V(x, q_1, a_1, \dots, q_{k-1}, a_{k-1}, q_k, r_k)$
- V is PTIME, P can safely be restricted to PSPACE.
 - Since P takes a random input, r , languages are recognized with completeness and soundness parameters.
- We saw last time that $IP = PSPACE$.



IP Verifier



MIP

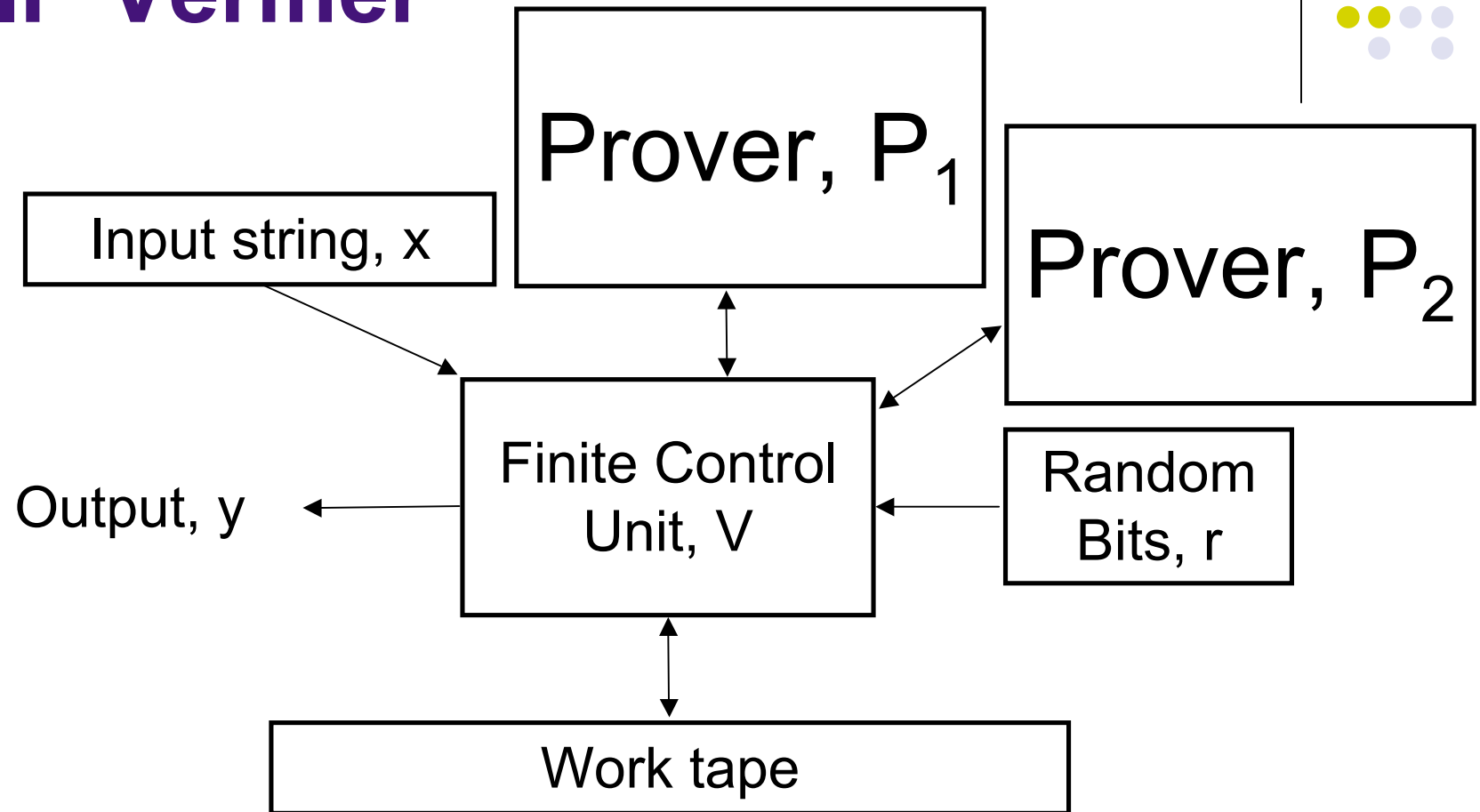


- MIP is defined like IP, except with multiple provers. The provers can be pitted against each other.
 - It turns out $MIP = NEXPTIME$.
 - Just two provers and one round of interaction suffice.
- In either IP or MIP, multiple repetitions of the proof protocol can drive error rates exponentially low.
- With MIP, we have an additional option. Ask many questions at once.
 - This is known as parallel repetition.

*See end of lecture 7 for citations.



MIP Verifier





PCP and MIP

- MIP is incredibly powerful, but what if we keep questions short ($O(\log(n))$)?
- The PCP theorem implies NP-Complete problems can be reduced to gap instances of 3SAT.
- We have short a two prover one round protocol:
 - Ask P_1 the assignment to the three variables in a clauses
 - Ask P_2 the assignment to one of the variables
 - Check for disagreement.
- Multiple sequential repetitions increase soundness.
 - What about asking multiple questions at once? Yes!
 - This results from the parallel repetition theorem (Raz, 1998)

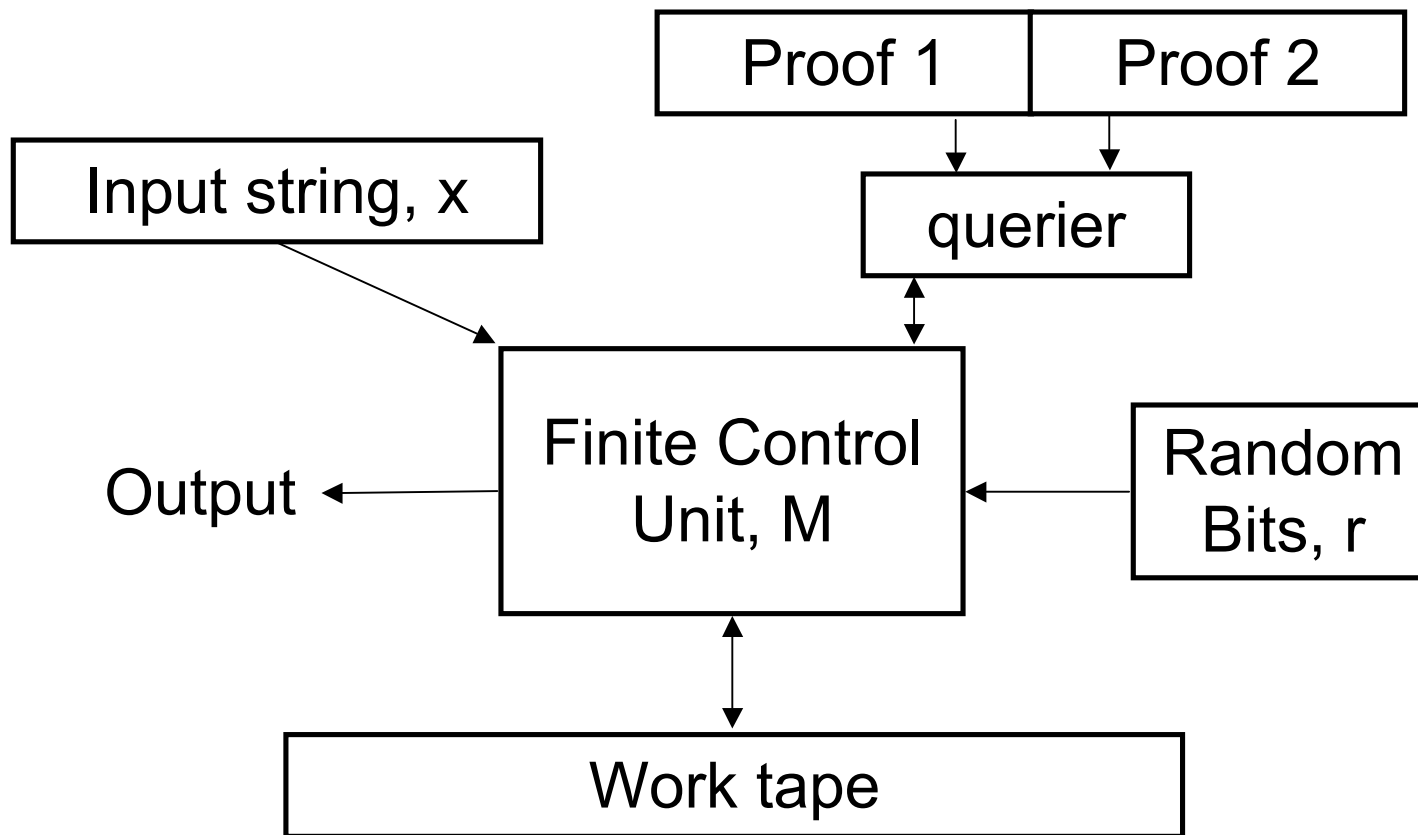


Parallel Repetition

- The parallel repetition theorem says that
 - Through t parallel repetitions, we can reduce the soundness from s to $(1 - s^a)^{bt}$, where $a, b = o(1)$
- A PCP can be considered a one round MIP.
 - Different parts of the proof represent each prover.
- This implies the result we proved:
 - $\text{PCP}_{1, 1/2} [1, \log(n)] = \text{PCP}_{1, 1/n} [\log(n), \log(n)]$.
- Since $\text{MIP} = \text{NEXPTIME}$, we also have:
 - $\text{NEXP} = \text{PCP}_{1, \exp(-n)} [\text{poly}(n), \text{poly}(n)]$



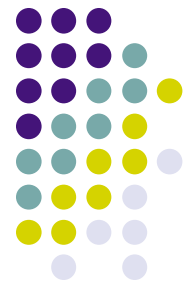
MIP with PCP Verifier





A 2 query PCP (sort of)

- Now we have a two query PCP, in a larger alphabet.
- We know that NP-complete problems can be reduced to 3SAT via a gap introducing reduction.
- Using our 2 prover model
 - Ask the first prover the assignment to all variables in some set of k clauses.
 - Ask the second the assignment to some set of k variables, at least one from each clause.
 - The parallel repetitions theorem states that regardless of the original gap, there is some k such that our soundness is close to 0.



Reducing the Alphabet

- In the PCP theorem, we were able to reduce the alphabet from $\{1, \dots, m\}$ to $\{0, 1\}$ using Walsh-Hadamard Codes.
 - If x is the binary representation of a variable ranging 1 to m , $WH(x)$ lists all m different sums of x 's bits.
 - $WH(x)$ and $WH(y)$ are $1/2$ -close if $x \neq y$.
 - If $WH'(x)$ is ε -close to $WH(x)$, we can use two queries to determine any entry in $WH(x)$ with probability at least 2ε .
 - RECALL: $WH(x)_s = WH(x)_{s'} + WH(x)_{s'+s}$.
 - If $WH'(x)$ is not ε -close to any codeword $WH(x)$, it turns out we can detect this with probability at least $\min(\varepsilon, 1/2)$.
 - $\text{Prob}[WH'(x)_s = WH'(x)_{s'} + WH'(x)_{s'+s}] \leq \max(1 - \varepsilon, 1/2)$
- Now we use an even longer code...



The Long Code

- If x is a $b = \log(m)$ bit string, $\text{LONG}(x)$ has 2^m entries, one for each function of x .
- A function of b bits is represented by a $2^b = m$ row truth table. There are 2^m possible functions.
- Again, $\text{LONG}(x)$ and $\text{LONG}(y)$ are $1/2$ -close if $x \neq y$.
- If $\text{LONG}'(x)$ ε -close to $\text{LONG}(x)$, we can use two queries to find any $f(x)$ with probability at least 2ε .
 - $\text{LONG}'(x)_{f(x)} = \text{LONG}'(x)_{g(x)} + \text{LONG}'(x)_{f(x) + g(x)}$
- Again, if $\text{LONG}'(x)$ is not close to a codeword, we can detect this with probability close to $1/2$
 - TEST: $\text{LONG}'(x)_{f(x)} = \text{LONG}'(x)_{g(x)} + \text{LONG}'(x)_{f(x) + g(x)}$



PCP using the Long Code

- Our 2 query PCP verifier asked two questions:
 - What are the values in k clauses?
 - What are the values of k variables?
- It then checks if the two answers, a_1 and a_2 , are consistent:
 - For some function h , check $h(a_1) = a_2$.
- If we pick a second random boolean function, f , we can perform the check with probability $1/2$.
 - For some random f , let $g(x) = f(h(x))$, check $g(a_1) = f(a_2)$.
 - The soundness of this test can't be guaranteed.
- This type of test uses the long codes of a_1 and a_2 .



A Three Query PCP

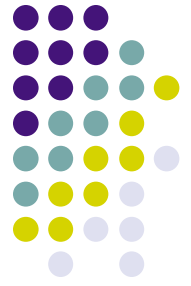
- Assume the proof consists of $\text{LONG}(a_1)$ and $\text{LONG}(a_2)$ for every possible pair of queries.
- We check $g(a_1) = f(a_2)$ using a random function, $g'(x)$
 - $\text{LONG}(a_2)_{f(x)} = \text{LONG}(a_1)_{g'(x)} + \text{LONG}(a_1)_{g(x) + g'(x)}$
- This test would have perfect completeness, but it must be modified slightly.
 - When checking $\text{LONG}(a_2)_{f(x)}$, we sometimes check f 's compliment.
 - The function indexed in the last term must have a small amount of “random noise” added to it.
- It leads to a 3 query PCP with completeness $1 - \epsilon$ and soundness $1/2 + \epsilon$.
- For each randomly chosen pair of questions, the test is linear.



Hardness of 3SAT

- The protocol shows $NP = PCP_{1-\epsilon, 1/2+\epsilon} [3, \log(n)]$.
 - Language in NP can be recognized by a verifier M that makes 3 queries to a proof y given some random input r.
 - In other words, $M_{r,x}(y)$ is a function of 3 bits of y, plus it is linear.
- The DNF of each $M_{r,x}(y)$ involves 4 clauses of 3 variables each.
- If a string is not in the language, close to 1 out of 8 clauses is unsatisfied.
- Unless $P = NP$, the known 7/8-approximation of 3SAT is the best possible.

Completeness and Soundness



- Proving completeness is easy. If the answers are correctly encoded, we will accept w.h.p.
- Proving soundness is more difficult. To show it is difficult to cheat, Fourier Analysis is used.
- We prove the simpler soundness result we used in Step 3 of the PCP theorem.
 - If $WH'(x)$ is not ε -close to any codeword $WH(x)$,
$$\text{Prob}[WH'(x)_s = WH'(x)_{s'} + WH'(x)_{s'+s}] \leq \max(1 - \varepsilon, 1/2)$$



Soundness of $WH'(x)$

- For a binary string x in $\{0,1\}^b$, $WH(x)$ lists all $2^b = m$ sums of x 's bits.
 - Each sum is indexed by one of m binary b -tuples.
- For the purpose our analysis, we take binary to mean $\{-1, 1\}$ (that is, 0 is replaced with -1).
 - Now $WH(x)$ is all m products of x 's bits.
 - Also, let $\text{dot}(x, y) = E[x_i y_i]$ (meaning the standard dot product by m)
- The Fourier basis of $\{0,1\}^m$ is f_α for each subset α of $\{1, \dots, b\}$, where $f_{\alpha, x} = \prod_{i \in \alpha} x_i$.
 - Each f_α corresponds to a linear functions of $\{0,1\}^b$.
- Notice that the basis is orthonormal, so every $WH(x)$ can be represented as the sum of basis elements, $\sum WH_\alpha(x)$.
- Also $\text{dot}(WH(x), WH(y)) = \sum WH_\alpha(x)WH_\alpha(y)$.



More Soundness

- Using our new alphabet of $\{-1, 1\}$, we wish to show that:
 - If $\text{Prob}[WH'(x)_s = WH'(x)_{s'} \cdot WH'(x)_{s \cdot s}] \geq 1/2 + \epsilon$, then $WH'(x)$ there is some basis element f_α such that $\text{dot}(WH'(x), f_\alpha) \geq 2\epsilon$.
 - We call $\text{dot}(WH'(x), f_\alpha)$ fourier coefficient c_α of $WH'(x)$
 - s' is chosen at random and $s' \cdot s$ is pairwise multiplication.
- We can prove $E[WH'(x)_s \cdot WH'(x)_{s'} \cdot WH'(x)_{s \cdot s}] \geq 2\epsilon$
 - Write each codeword as sum of Fourier coefficients.
 - Simplify using $f_{\alpha, s' \cdot s} = f_{\alpha, s'} \cdot f_{\alpha, s}$
 - Use linearity of expectation
 - Simplify with orthonormality



Conclusion

- Using the PCP theorem and parallel repetition, we can construct a high soundness, high completeness PCP.
- Using the Long Code, we can ask long questions using only a few queries.
- Combining these, Hastad (2001) was able to show that $NP = PCP_{1-\epsilon, 1/2+\epsilon} [3, \log(n)]$.
- This implied that a PTIME $7/8$ -approximation for 3SAT is as good possible unless $P = NP$.
- The approach applies to other problems as well.