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Unlike many computer scientists who concentrate their efforts on discovering new NP-complete problems, trying to prove $P \neq NP$ or establishing new theoretical models, Professor Hu's efforts have been concentrated on:

(1)   inventing new algorithms that can solve well-known problems more efficiently than existing algorithms;

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