















putting forward a novel framework for identifying its causal agents. In future, this can potentially replace or complement traditional stress/relaxation detection methods and can contribute to improved applications and services such as healthcare, traffic management or customer care. It is a promising step in towards the greater goal of leveraging the Web and specifically social media data.

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