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LIST OF ABBREVIATIONS

BPE	Benign Prostate Enlargement
BPH	Benign Prostate Hyperplasia
DSD	Detrusor Sphincter Dyssynergia
E	Energy
kHz	kiloHertz
LUTD	Lower Urinary Tract Dysfunction
LUTS	Lower Urinary Tract Symptoms
MUT	Mid-urethral tape
PVR	Post-void residue
Qavg	Q average (average flow rate)
Qmax	Q maximum (maximum flow rate)
SUF	Sonouroflowmetry
UF	Uroflowmetry
VV	Voided Volume