信号直接定位技术综述(中文/English)

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摘 要:通过被动接收辐射源信号并确定其位置的无源定位技术,在电子侦察、搜索救援等领域具有重要价值。 传统测向交叉、时差、频差等无源定位技术通常需要两步实现辐射源的定位,第1步通过截获的信号采样估计与 辐射源位置有关的定位参数,第2步利用这些定位参数求解辐射源的位置,这种处理方式带来了信息量损失、定 位参数关联困难、系统灵敏度需求高等问题。近十几年来,兴起了一种无需估计定位参数,而是直接处理原始采 样信号获得辐射源位置估计的直接定位(DPD)技术,其具有适应低信噪比、无需参数关联、鲁棒性强等优势。在 对已有直接定位技术进行全面总结基础上,该文归纳了基于不同信息类型的典型直接定位技术、特殊信号直接定 位技术、高分辨率高精度直接定位技术、直接定位快速算法以及直接定位模型误差校正技术等已有成果,并对直 接定位未来发展方向进行展望。

 关键词:无源定位;直接定位;分辨率;定位精度

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Direct Position Determination: An Overview (in English)

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Abstract: Passive localization technology, which intercepts emitter signals and passively determines their positions, has important value in fields such as electronic reconnaissance and search and rescue. The traditional passive localization technology approach, *i.e.*, cross-bearing, time difference of arrival, and frequency difference of arrival, requires two steps to estimate the emitter position—estimating the parameters related to the positions and then solving the emitter positions based on the previously estimated parameters. This process results in loss of information and difficulty with data association, and requires high system sensitivity. In recent years, a Direct Position Determination (DPD) method was developed that obtains the emitter positions directly by processing the original sampled signals and requires no estimation of intermediate parameters. This method is robust, achieves high performance with a low signal-to-noise ratio, and requires no parameter association. In this paper, we present a comprehensive summary of existing research on DPD and an overall introduction of DPD, including typical DPD methods based on different information types, DPD of special signals, high-resolution high-accuracy DPD, fast DPD algorithms, and the calibration technology used to address DPD model errors. We also consider the future outlook for DPD.

Key words: Passive localization; Direct Position Determination (DPD); Resolution; Localization accuracy

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1 引言

无源定位技术是一种自身不发射电磁信号,仅 利用单个或多个接收站截获的信号,确定辐射源位 置的技术,又称为被动定位技术。相对于有源的定 位方式,该技术具有电磁隐蔽性好、可定位距离远 等优势,在电子侦察、搜索救援、无人驾驶、智能 物流等军用和民用领域具有重要应用价值,已经成 为世界各国的研究热点^[1-26]。

根据估计辐射源位置的步骤,可以将无源定位 技术分为两类,即传统两步法与一步法。传统两步 法定位的基本思路[1]为: 第1步, 通过接收机截获 辐射源信号,对原始采样信号进行处理,使用空间 谱等方法^[2-4]估计蕴含辐射源位置信息的定位参 数; 第2步, 利用定位参数与辐射源位置之间的关 系建立并求解方程,实现定位。第1步中估计的定 位参数多种多样,例如由于信号到达干涉仪不同天 线波程差导致的相位差[5-7],或者由于信号到达不 同观测站传播路径的差异导致的时间差(Time Difference Of Arrival, TDOA)^[8-11], 或者由于目标 和观测站之间相对速度差异导致的信号到达不同观 测站的频差(Frequency Different Of Arrival, FDOA)^[12,13],以及多普勒变化率(Doppler rate)^[14-17]、 或者信号到达角方向(Direction Of Arrival, DOA)^[18-20]、接收信号强度(Received Signal Strength, RSS)^[21-25]等。实际上以上定位参数在空 间中对应的是定位线或者定位面(曲面)^[26],例如 TDOA对应的是双曲线或双曲面、DOA对应的是 直线或平面、FDOA对应的是等频差曲面等。传统 两步定位法在第2步中利用这些定位线或定位面相 交,通过穷尽搜索法[27,28]、最小二乘法[29]、伪线性 法^[30]、泰勒展开和梯度结合法^[31]等方法,估计辐射 源的位置。

另一种无源定位方法为一步定位法。相对于传 统两步定位法,一步定位法不需要估计定位参数的 过程,而是直接对原始采样信号进行处理,利用信 号中蕴含的辐射源位置信息,构建仅与辐射源位置 相关的目标函数(代价函数),通过穷尽搜索等优化 算法实现定位^[32-37],由于其实现的是从信号到辐射 源位置的直接估计,因此一般被称为直接定位法 (Direct Position Determination, DPD)。DPD的基 本思路最早可以追溯到Wax和Kailath^[38]在1985年 提出的分散式处理方法,随后在2004年由以色列学 者Weiss^[33]正式提出。

根据已有研究^[39-44],可以总结以下直接定位方 法相对于传统两步定位方法的优势和不足。由于 DPD无需估计定位参数,因此避免了不同辐射源 参数关联的过程,可以对同时同频等传统方法难以 处理的信号进行定位^[39]。另外,DPD的代价函数 仅与辐射源位置有关,充分利用了信号来自于同一 个辐射源的先验信息^[33],因此其在低信噪比下具有 更高的定位精度。最后,也有相关研究表明^[40-42], 在模型误差干扰的情况下,DPD相较于两步法具 有更好的鲁棒性。DPD获得以上优势的同时,也 伴随着一定的代价。由于DPD处理的是原始采样 信号,而不是像两步定位法那样处理的是定位参 数,并且难以获得辐射源位置的解析解,因此其计 算量相对较大^[45]。图1给出了传统两步法定位系统 和直接定位系统的示意图。

DPD自提出以来,受到了国内外诸多学者的 研究,本文针对DPD目前研究的5个热点问题,总 结国内外直接定位技术的研究成果,具体安排如 下:第2节介绍基于不同信息类型的典型直接定位 技术;第3节总结针对某些特殊信号的直接定位技 术;第4节分析直接定位在高分辨率高精度方面的 成果;第5节归纳直接定位在快速算法的研究;第 6节描述了现有的直接定位模型误差校正技术,最 后在第7节中给出直接定位技术的总结和展望。

2 基于不同信息类型的典型直接定位技术

对于传统两步定位法,由于使用的是DOA, TDOA, FDOA等定位参数实现定位,因此这些参 数也可以被称为观测量。虽然DPD并不需要估计 这些参数,但是当对信号建模时,依然需要考虑辐 射源位置信息蕴含在哪些变量中,为了与两步法进 行区分,将DPD中蕴含辐射源位置信息的变量统 一称为信息类型。DPD早期的研究主要集中于建 立基于不同信息类型的信号模型,然后利用不同信 号模型构建代价函数实现定位。最早的直接定位是 基于到达角(Angle Of Arrival, AOA)和TDOA两个 信息类型提出的[33]。它利用多个固定阵列对单个窄 带信号进行定位,除了通过阵列响应考虑辐射源的 AOA之外,还使用傅里叶变换,提取信号中的TOA 信息,最终构建了基于AOA和TDOA的信号模 型,随后利用最小二乘法建立了仅与辐射源位置相 关的代价函数,最终通过穷尽搜索法实现了辐射源 位置的估计。其仿真结果表明,在低信噪比情况 下,DPD定位精度要优于仅使用AOA的两步定位 法、仅使用TDOA的两步定位法以及两者的组合。 同样使用AOA和TDOA两种信息类型,对单个辐 射源的直接定位也可以推广至对多个辐射源的直接 定位^[46,47]。

当TDOA带来的辐射源位置信息无法使用时, 仅使用DOA也可实现直接定位。例如仅使用单个





运动阵列截获信号并对其定位时,不存在多观测站 截获信号的TDOA,此时可以使用DOA构造直接 定位代价函数进行定位^[34,35,48]。而当需要采用相参 处理的方式联立多个阵列的响应向量时,为了避免 TDOA造成观测模型无法相参处理,可以将TDOA 视为观测信号的未知相位量,构建仅基于DOA的 相参类型直接定位代价函数实现定位^[49]。

除此之外,当多普勒频移显著时,FDOA这一 信息类型也可以实现辐射源的直接定位[42-45],利用 空间分布的多个运动的单传感器截获静止辐射源的 信号,在假设信号载频已知的情况下,可以建立了 截获信号与辐射源位置之间的直接关系,使用最大 似然(Maximum Likelihood, ML)准则构建代价函 数并利用穷尽搜索的方法也实现了对辐射源的直接 定位。除了仅使用FDOA这一信息类型的直接定位 方法之外,多普勒效应相关的信息类型在直接定位 中也常与其它信息类型相组合以提高定位的精度, 例如文献[50-52]提出了一种基于TDOA和FDOA的 直接定位方法,它们同样采用了多个运动的单传感 器截获静止辐射源的信号,除了FDOA之外,还考 虑了信号到达不同传感器的波程差导致的TDOA, 从而直接建立了截获信号和辐射源位置之间的模 型,通过穷尽搜索法实现直接定位。而文献[53]则 使用多个运动的阵列截获静止辐射源信号, 忽略 TDOA, 提出了一种仅基于到达角和FDOA的运动 多站直接定位方法。如果观测站和辐射源之间相对 静止,多普勒效应可以忽略,此时仅有TDOA这一 信息类型蕴含着辐射源的位置信息,文献[45,54]就 在这一定位场景下,提出了仅基于TDOA的多站直 接定位方法。

从以上介绍中不难看出,直接定位利用的信息 类型包括DOA,TDOA,FDOA、多普勒频移等, 在实际应用中,直接定位会根据具体定位场景设定 选取合适的信息类型。例如,如果使用空间分布的 多个静止单传感器进行直接定位,仅需要考虑 TDOA,如果使用空间分布的多个静止阵列进行直 接定位,则需要考虑DOA和TDOA,如果观测站 运动,则需要额外考虑FDOA等多普勒参数。选取 恰当的信息类型并建立准确的信号模型是保证直接 定位精确度的前提。

3 特殊信号的直接定位技术

对于DPD来说,截获信号的模型是构建代价 函数进而实现定位的关键。现有的信号直接定位技 术研究大部分以窄带信号为目标^[33-56],在本节中主 要介绍特殊信号的直接定位相关研究。为了增加 DPD对信号种类的适应性,拓展DPD的应用范 围,许多学者对特殊信号的直接定位进行了研究。 这些研究可以分为两类,一类是针对原本直接定位 方法无法处理的信号开展的,它通过增加预处理、 改进代价函数等手段,使得直接定位方法具备对这 种信号进行处理的能力;另一类则是在直接定位过 程中,充分利用特殊信号的性质作为先验信息,改进代价函数,从而提升直接定位的性能。

3.1 第1类特殊信号

直接定位处理的第1类特殊信号主要包括宽带 信号、跳频信号以及相干信号等。文献[57]是最早 考虑一般性宽带信号的直接定位的,它建立了运动 多站截获宽带信号的模型,利用TDOA和FDOA两 个信息类型构建了直接定位代价函数,将直接定位 的应用拓展到了一般性宽带信号。文献[58]则将宽 带信号划分成多个片段进行相参累加处理,进一步 提高了直接定位对宽带信号的定位性能,这种相参 累加的信号处理方式也将在下一节中进行介绍。此 外,利用多个观测阵列截获的宽带信号,可以构建 一种基于空间-时间观测向量的代价函数,这种处 理方式将所有的截获信号蕴含在一个单独的空时协 方差矩阵之中,有效增强了DPD的鲁棒性^[59,60],并 且提升了DPD的自由度^[61]。以上考虑的宽带信号 其带宽相较于载频实际上还是很小的,因此其基带 信号的多普勒变化是被忽略的。文献[62]则考虑更 大带宽的信号,其带宽的大小与采样率相当,因此 可以将截获信号建模成为随时间平移和缩放的函 数,在此基础上构造了基于最大似然的代价函数, 实现了对该类信号的直接定位。

直接定位技术相关研究中一般假设信号频率固 定,但目前跳频通信信号等频率时变的信号也被广 泛应用。基于跳频信号多个子带只在频带范围内占 用部分带宽,频带范围内只有少数非0值的特征(即 频域有限分布特性),文献[63]用跳频信号的离散谱 建立截获信号模型,分别基于最大似然和最大相关 积累两种方法构建了直接定位代价函数,实现了对 单个跳频信号辐射源的直接定位。在实际情况中, 跳频信号和固定频率信号可能同时存在,但目前未 见有相关研究,针对更为复杂电磁环境的直接定位 技术研究依然存在相当大的空白。

另外相干(coherent)信号在阵列信号处理中受 到了学者们的广泛研究^[64-69],对于直接定位来说, 如果依然使用多重信号分类(MUltiple SIgnal Classification, MUSIC)的方法构建代价函数,直接定 位性能将会严重衰减甚至失效。为此,文献[70]提 出了基于解相干MUSIC的直接定位算法,通过接 收信号协方差矩阵共轭重构,实现了相干信号的直 接定位; 文献[71]提出使用自适应迭代的方式避免 协方差矩阵秩亏,也可以实现相干信号的直接定 位。除此之外,空间平滑等在相干信号阵列测向中 已经验证有效的方法^[72-74],也可以推广到直接定位 之中,相应方法的优势和不足在直接定位之中也待 分析讨论。

3.2 第2类特殊信号

直接定位处理的第2类特殊信号主要包括正交频 分复用(Orthogonal Frequency Division Multiplexing, OFDM)信号、非圆信号(noncircular signal)、恒模 信号、周期平稳信号(cyclostationary signals)以及 同步相参脉冲串(Synchronous Coherent Pulse Trains, SCPT)信号。OFDM是一种应用广泛的信 号调制技术,它可以有效对抗色散信道、多径等问 题。其通过发射器反快速傅里叶变换(Inverse Fast Fourier Transform, IFFT)产生OFDM信号, 然后在 接收端通过快速傅里叶变换(Fast Fourier Transform, FFT) 转换到频域。文献[75,76]针对OFDM信号提 出了一种基于最大似然的直接定位方法,该方法既 考虑了OFDM信号中未知的数据部分(data tones), 也考虑了已知的导频部分(pilot tones),据此提出 了对其位置估计的最大似然估计器(Maximum Likelihood Estimator, MLE),其性能要优于忽略 己知导频部分的一般性DPD。文献[77]则提出了基 于谱的OFDM信号直接定位方法,减少了搜索的维 数。非圆复信号也是一种备受关注的信号[78-82],它 与圆复信号最大的区别就是非圆复信号的实部和虚 部不是独立的。常见的非圆复信号有幅度(Amplitude Modulation, AM)调制信号、幅移键控(Amplitude Shift Keying, ASK)信号和二进制移相键控(Binary Phase Shift Key, BPSK)信号。文献[83,84]就是利 用非圆复信号的上述性质对其进行直接定位,由于 先验信息的引入,提升了直接定位的性能。恒模信 号(相位调制信号)是一种应用广泛的通信信号,例 如FM, FSK, PSK等, 它们的显著特征是其复包络 具有恒模特征。利用该特征, 文献[85]改进了恒模 信号直接定位代价函数,构建的基于最大似然的直 接定位方法可以明显提高目标位置估计精度。周期 平稳信号是一种期望和自相关函数为周期性的信 号,利用这种周期性可以将信号自相关的离散傅里 叶变换进行改写[86],从而构建周期性的直接定位方 法。利用这一先验,该方法在白高斯环境下和窄带 干涉环境下都表现出了优良的性能。

SCPT信号是相参脉冲雷达系统中常用的信号 类型,它可以视为由一个稳定的主振荡器产生的连 续波截取形成的具有相同初始相位的脉冲串信号。 基于SCPT信号的这一特性,仅使用单个运动天 线,基于多普勒和多普勒频移即可实现该信号的直 接定位,具体方法在文献[87]中给出了介绍。除此 之外,本文作者还依据该类信号的特点,提出了单 站相参的直接定位技术^[88],仿真表明虽然其定位精 度没有改善,但是分辨率提升显著。

4 高分辨率高精度的多目标直接定位技术

随着电磁环境日益复杂,实现多个辐射源高精 度高分辨率的定位成为无源定位领域迫切的需求。 同样,很多学者也致力于研究高分辨率高精度的直 接定位。目前相关研究主要分为两类,一类是通过 改进构建代价函数的方法提高直接定位的分辨率和 定位精度,另外一类则是通过改进信号处理方式实 现高分辨率高精度的直接定位。

4.1 改进代价函数

最早提出的直接定位方法在构建代价函数时, 使用的是最小二乘或ML的准则^[33]。但是,为了实 现对多个辐射源的定位, 文献[46,47]提出了使用 MUSIC算法构建代价函数的直接定位。但是,在 使用MUSIC方法之前,首先需要对辐射源数量进 行估计。为了避免这一问题, 文献[89-93]提出使用 最小方差无失真响应(Minimum Variance Distortionless Response, MVDR) 方法构建直接定位的代 价函数。不同的是, 文献[89]处理的是仅包含多普 勒频移这一信息类型的观测信号模型, 文献[90]处 理的是包含DOA 和TDOA信息类型的观测信号模 型,而文献[91.92]处理的是包含DOA和FDOA信息 类型的观测信号模型, 文献[93]则处理的是仅包含 DOA信息类型的观测信号模型。不管MVDR是在 哪种截获信号模型基础上建立的代价函数,其分辨 率都要优于基于ML构建的代价函数,对相邻辐射 源的定位精度也更高。但是其分辨率与基于MU-SIC的代价函数相差无几,并且正如文献[94]所评 价的那样,当存在多个辐射源时,基于MVDR的 直接定位问题实际上是渐进有偏的[95-97],其定位精 度难以达到理论的克拉美罗下限(Cramér-Rao Lower Bound, CRLB).

除了MUSIC和MVDR两种改进的直接定位代价函数,本文作者曾尝试使用基于特征空间(Eigen Space, ES)的方法构建代价函数^[48]。该类型的代价函数是对基于MUSIC代价函数的一种改进,可以表示为

$$f_{\rm es} = f_{\rm e}/f_{\rm MUSIC} \tag{1}$$

其中,分母f_{MUSIC}是基于MUSIC的代价函数,而分 子f_e是利用噪声子空间和信号子空间的正交特性建 立的,它的特征是若当前搜索位置在辐射源真实位 置处时,它是一个较大的值,而当前搜索位置不在 辐射源真实位置处时,它的值几乎为0。这相当于 是一种加权的MUSIC改进方法,该方法可以有效 提升直接定位的分辨率。在某次蒙特卡洛仿真中, 对空间中两个临近辐射源进行直接定位,各代价函 数的归一化空间谱等高线图如图2所示。

4.2 相参处理

另外一类则是通过相参处理的方式对观测信号 进行处理,构建相参类型的代价函数。目前直接定 位相参的处理方式可以分为两种,一种是针对宽带 信号提出的[58], 它将一个完整的宽带信号采样划分 成多个不重叠的短时间信号片段,等效形成多个窄 带信号采样,分别对这些短时间信号片段进行处理, 通过累加的方式构建代价函数,估计辐射源的位 置。这种处理方式与非相参的直接定位法[57]相比, 虽然都利用的是TDOA和FDOA这两个信息类型, 代价函数也都是基于ML的方法建立的,但是前者 具有更高的定位精度。另外一种相参处理则是将多 个阵列的阵列响应向量联立成为一个大的阵列响应 向量^[49],将空间中多个阵列分别进行信号处理的方 式转变成空间中一个大的阵列集中进行信号处理的 方式,可以等效视为阵列孔径的增加。这种相参处 理和其它非相参处理的示意图如图3所示。通过这 种处理,直接定位的定位精度和分辨率都大幅度提 升,但是由于联合的阵列向量维数的提升,使得计 算量也大大增加。除此之外,由于这种相参处理将 多个阵列等效成一个阵列,因此其定位性能受阵列 间时频不同步、阵列模型误差等因素影响较大。

4.3 改进阵列构型

目前直接定位技术主要依托均匀线阵实现信号 截获,并利用谱分解的方法实现多个辐射源的定 位,因此其最多可定位的辐射源个数为M-1个, 其中M为均匀线阵的阵元数。这种较低自由度的直 接定位技术难以满足当前多目标复杂电磁环境。为 解决这一问题,稀疏阵列(Sparse Array, SA)中的 互质阵列首先被应用于对非圆信号波形的直接定位 之中^[98],实现了直接定位自由度和定位精度的提升。 该工作是基于非圆信号特征实现的阵列孔径和观测 数据维度的增加,实质上其性能提升仅仅来自于互 质阵列物理阵列孔径的增加和非圆信号的特性,并 未充分利用互质阵列对应的差分共性阵列(difference co-array)的优势。同样是针对非圆信号,为了充分挖 掘稀疏阵列特性对直接定位性能的提升, 文献[99,100] 分别将互质阵列和嵌套阵列引入到对非圆信号的直 接定位之中,除了应用非圆信号的特征,该工作发 挥了嵌套阵列和互质阵列在增加直接定位自由度方 面的优势。

改进阵列构型除了在增加自由度方面的效果, 对于提升定位的精度和分辨率又会带来增益。最近, 本文作者提出了一种基于旋转线阵(Rotating Linear Array, RLA)的运动直接定位方法^[88]。通过转台等 时变机构牵引阵列旋转,实现各阵元相对参考阵元











Fig. 3 Diagrammatic drawings of coherent processing and noncoherent processing of DPD

的时变,其结构示意图如图4所示,其中ω为旋转 角速度,d为阵元间隔。经过理论性能分析和计算 机仿真验证可知,采用旋转均匀线阵截获信号,并 构建相适应的直接定位代价函数,可以显著提升直 接定位的定位精度和分辨率,并且可以消除固定均 匀线阵的定位模糊区域,增加系统的可观测性。以 CRLB计算的使用单个均匀线阵和旋转均匀线阵直 接定位的几何精度因子(Geometrical Dilution Of Precision, GDOP)如图5所示。

除了将稀疏阵列和旋转阵列应用于直接定位, 多输入多输出(Multiple-Input Multiple-Output, MIMO)领域的部分学者也倡议将MIMO系统应用 于直接定位。利用MIMO雷达的多个接收天线截获 目标信号,文献[101]提出了一种基于最大似然的直 接定位算法,该方法充分利用了MIMO雷达分辨率 精度方面的优势,适用于有源和无源两种MIMO系 统,在低信噪比下表现出比两步法更高的定位精度。 文献[102]则提出了一种多径条件下基于MIMO的直 接定位算法,实现了对信号已知辐射源的高精度定



图 4 旋转线阵结构示意图

Fig. 4 The diagrammatic drawing of rotating array

位。以上提到的定位方法都利用的是AOA和TDOA 这两种信息量,而文献[103]则提出一种利用 MIMO雷达仅基于多普勒频移实现直接定位的方 法,该方法在多个运动站发送信号,经目标发射后 被多个静止观测站接收的有源应用场景中有效。

除了以上介绍的3种方法之外,也有部分学者 使用稀疏重构或者压缩感知的手段直接估计辐射源 的位置^[104,105]。这种处理方式无需辐射源个数的先 验信息,并提升采样数较少状态下的直接定位精度 和分辨率。

5 直接定位快速算法

给定直接定位的代价函数之后,就可以通过代 价函数求解辐射源的位置。由于代价函数与辐射源 位置之间高度非线性,难以给出位置估计的解析 解。目前,已有的直接定位方法大部分都是通过穷 尽搜索法进行求解的。但是由于其处理的是原始信 号采样点,相比于两步定位法中的中间参数,数据 量极大,因此带来的计算复杂度也很高。穷尽搜索 法需要在可行解空间中进行网格划分,而划分的网 格密度决定着计算量的大小,这就造成了计算复杂 度与精度之间的矛盾。

目前交替投影(Alternating Projection, AP)技术^[106]、解耦算法(Decoupled Algorithm, DA)^[52]、 期望最大算法(Expectation Maximization, EM)^[45] 以及牛顿或泰勒级数迭代算法^[56,107]已经应用于快速 求解直接定位的代价函数。AP算法在解决基于 ML的直接定位问题中可以有效地将多维搜索转换 为多个低维搜索,一定程度减少了计算复杂度^[108]。 EM算法也可以用来解决基于ML的多站直接定位 的计算复杂度问题,它将所有阵元的输出建立为不





Fig. 5 The GDOP of DPD using stationary array and rotating array

完备集(incomplete data),而将所有阵元与辐射源 位置之间的距离建立为未观测到的完备集(unobserved complete data),使用EM算法,将辐射源位置和 各个阵列的不同增益以及信号发射时间分离开,将 多维的优化问题转换为多个低维优化的问题,对使 用多站进行单目标的直接定位具有明显的效果。文 献[52]则针对非圆信号(noncircular signals)提出了 一种解耦的快速算法。利用非圆信号的特征,该方 法可以将复数的特征值分解问题转换成实数的特征 值分解,同时将2Q 维的优化问题转换成为Q 个2 维迭代优化问题,它本质上是一种利用非圆信号的 特征改良的AP算法,仅对非圆信号有效,对于其 它信号, 其等效为AP算法。针对将矩阵最大特征 值作为代价函数的直接定位方法,基于Hermitian 矩阵特征值扰动定理可以使用Newton迭代对该类 型代价函数进行迭代求解[56];此外,也可以类似地 使用泰勒级数迭代法则实现一般性代价函数的迭代 求解[107]。它们都极大程度地降低了直接定位代价 函数求解的计算复杂度。与其它类似的迭代方法一 样,这两种方法对初始迭代点敏感,当初始点选取 不当时,容易造成迭代发散。相关文献中提出使用 两步法[56,107]来确定初始点,但这种思路有可能在低信 噪比下失效,难以体现DPD对低信噪比的适应能力。

以上提到的方法都难以避免重复多次对代价函数进行低维搜索或者初始化困难的问题。为了进一步降低计算复杂度,部分学者尝试将智能优化算法应用到求解直接定位的代价函数之中^[48]。实际上,利用直接定位代价函数求解辐射源位置实际上是一个优化问题,而优化问题是一个广泛存在于科学研

究中各个领域的问题。从优化问题求解极值解个数 的角度出发, 求解直接定位代价函数本质上属于多 模态优化 (Multimodal Optimization, MO)^[109]。基 于环邻域拓扑的无参数粒子群算法(Ring Neighborhood Topology based PSO, RNTPSO)^[110,111]在解 决这一问题上表现出了较为理想的效果。因此,本 文作者在文献[48]中提出了一种基于小生境粒子群 优化法(RNTPSO中的一种)和梯度类法(Broyden-Fletcher-Goldfarb-Shanno, BFGS)的融合直接定位 快速算法,大大降低了直接定位算法的计算复杂 度。该快速算法的基本思路是,先利用基于小生境 粒子群优化法在较少的粒子进化次数后,通过简单 的聚类方法对进化结果进行聚类,给出辐射源位置 的粗估计;然后利用梯度类方法对其进行迭代,直 至收敛。所提算法一种可能的代价函数优化过程如 图6所示。

6 直接定位模型误差校正技术

与其它参数估计问题一样,直接定位对辐射源 位置估计的高精度特性是以准确的模型为前提的。 当模型存在误差,直接定位的性能将严重退化,因 此分析误差模型下直接定位方法的性能以及研究消 除模型误差干扰的方法对于将直接定位推广到实际 应用中具有重要的意义,已经吸引了国内外学者大 量的研究。

目前,已有的针对模型误差条件下的直接定位 方面的研究可见于文献[39-42,112-115]。其中,文 献[39,41]测试了在阵列位置误差、多径、耦合等误 差项存在的情况下直接定位方法的性能。结果表明



图 6 基于小生境粒子群优化和BFGS的直接定位代价函数优化过程示意图 Fig. 6 The optimized process of DPD cost function based on RNTPSO and BFGS

由于直接定位可以在处理过程中忽略较差的观测而 使用高质量的观测进行定位,其定位性能在误差模 型条件下依然保持着对两步定位法的优势。与这些 研究类似,文献[114]仅考虑了由于区域反射体造成 的多径现象对直接定位的影响,并获得了与前面文 献中得到的类似结果。此外,文献[115]考虑了非视 距(Non-Line-Of-Sight, NLOS)路径传播的多径对 直接定位性能的影响,并推导了该情况下多径造成 的定位误差协方差矩阵的解析表达式。所有以上所 提文献都集中于验证各种各样误差影响下的直接定 位的性能。然而,它们并没有提出能有效消除这些 误差干扰的方法。

与其不同的是, 文献[107,112]将这些误差造成 的阵列模型的不确定性建模为高斯随机变量, 然后 使用自校正(self-calibration)方法消除这些误差的 干扰。它们的方法可以有效减少阵列模型误差并达 到定位的CRLB。然而,该方法依赖于误差的先验 信息,即误差的均值和协方差是已知的。在实际情 况中,这些先验信息是难以获得的。针对确定性的 传感器幅/相误差,文献[116]建立了其干扰下的截 获信号模型,分别基于MUSIC和ML构建了自校正 的直接定位方法。这种自校正的方法不需要任何先 验信息,并且在自校正过程中传感器幅/相误差的 估计是通过解析解的形式给出的,计算量不大,因 此具有较好的实用性。但是由于自校正的精度依赖 于外辐射源信号的信噪比,当信噪比较低时自校正 性能衰减,这将导致直接定位在低信噪比下定位精 度高的优势无法保障。

为了解决这一问题,在工程应用中习惯借助友 方已知位置辐射源(标校站)对确定性误差进行校 准。文献[117]考虑了多个传感器时钟不同步的问 题,并使用几个锚源(例如已知位置的广播站等)对 时钟不同步进行了校准。为了解决文献[116]中的问 题,本文作者提出了基于标校源的直接定位方法对 确定性传感器幅/相误差进行校正^[118],考虑了标校 源信号准确已知和信号未知两种情况,给出的校正 定位算法可以达到相应的CRLB。

7 总结与展望

7.1 信号直接定位技术总结

依据直接定位所针对的信息类型、截获信号所 用的阵列类型、构建代价函数所使用的方法,可以 将直接定位进行详细分类,其在计算复杂度、定位 精度、分辨率、自由度各方面也表现出了不同的性 能,本节首先对以上内容进行总结,从上述角度出 发给出了直接定位技术的总结如表1所示。其中ExS 表示穷尽搜索。

以上介绍的都是在无源定位应用背景下的直接 定位技术,但实际上还有很多学者探讨了有源条件 下的直接定位技术^[46,58,101,103,107,119-123]。两者的区别 主要体现为接收传感器截获信号的未知和准确已 知^[46,103]。从信号处理的角度讲,信号已知情况下的

信息类型	阵列	代价函数	优化方法	文献	精度	分辨率	自由度	计算复杂度
DOA/TDOA	ULA	ML	ExS	文献[33]	中	低	低	高
FDOA	ULA	MUSIC	ExS	文献[46,47]	中	中	低	中
TDOA/FDOA	ULA	ML	ExS	文献[50—52]	中	低	低	高
DOA/ FDOA	ULA	ML	ExS	文献[53]	中	低	低	高
DOA/TDOA	ULA	MVDR	ExS	文献[89—93]	中	中	低	中
DOA	ULA	ES	RNTPSO	文献[48]	中	高	低	低
DOA/TDOA	MIMO	ML	ExS	文献[101,102]	高	高	低	高
FDOA	MIMO	ML	ExS	文献[103]	高	高	低	高
TDOA/FDOA	ULA	ML(Coherent)	ExS	文献[58]	高	中	低	高
TDOA/DOA	ULA	MUSIC(Coherent)	ExS	文献[49]	高	高	高	高
Doppler Shift/Rate	Antenna	ML	ExS	文献[87]	中	-	_	高
DOA	SA	MUSIC	ExS	文献[98—100]	低	中	高	高
DOA	RLA	MUSIC	ExS	文献[88]	高	高	低	中
DOA	ULA	MUSIC	AP	文献[106]	中	中	低	低
DOA/TDOA	ULA	ML	EM	文献[45]	中	低	低	中
DOA/TDOA	ULA	ML	DA	文献[52]	中	低	低	中

表 1 直接定位技术总结表 Tab. 1 Conclusive table of DPD

模型更为简单,构建的代价函数也更为直观^[88]。已 有文献证明即使在信号已知条件下,直接定位相对 于传统两步定位法低信噪比适应性更强的优势依然 保持^[119],这一特征使得直接定位在MIMO等雷达 系统中被广泛应用^[101-103,120,122]。此外,还有学者将 长合成孔径的技术引入到直接定位之中^[124],通过 单个平台的移动模拟形成长的阵列孔径,并以合成 孔径雷达的方式处理截获数据,实现了辐射源的定 位。该技术本质上是一种运动单站直接定位技术, 不同的是该技术涵盖了通过带通滤波器和傅里叶变 换处理估计发射信号频率的过程,并以辐射源与观 测站间的距离和方位代替辐射源位置的描述,通过 合成孔径雷达的处理方式实现了信号频率和辐射源 位置的联合估计,该技术在一定程度上拓展了直接 定位算法的设计思路。

7.2 信号直接定位技术展望

虽然到目前为止,直接定位技术的相关研究已 经取得了大量的成果,但受限于自由度难以满足当 前复杂电磁环境、通信压力大(多站直接定位)以及 计算复杂度高等实际问题,其难以在工程中应用。 针对直接定位技术依然存在的上述挑战,相关学者 也取得了一定的理论研究成果。例如,采用自适应 的直接定位方式减少站间转发次数,降低多站直接 定位的通信压力^[125,126];采用互模糊函数补全的方 法,降低代价函数的计算复杂度及观测站间数据传 输量^[127]等。从信号直接定位技术发展的角度看, 瞄准实际工程应用的直接定位技术已经成为目前研 究的主要趋势。在提升直接定位自由度、分辨率, 降低计算复杂度,消除实际情况下的典型误差等方 面存在着巨大的研究价值。因此,以下3个方面的 研究可能会成为后续直接定位研究的重要方向。

(1)基于智能优化方法的直接定位快速算法。 直接定位代价函数求解本质上是一个多模优化的问题。基于智能优化方法的直接定位快速算法研究可以进一步降低直接定位计算复杂度,突破现有硬件 条件的限制,有望实现直接定位的实时处理。特别 是对于利用单观测站的直接定位,实时处理还将避 免原始采样信号的下传、消除硬件存储容量的限 制,同时考虑靠单观测站直接定位无需时频同步、 无需站间通信的优势,其在工程中具有很好的应用 前景。目前已有学者开展了初步的探索,利用训练 好的多层感知器神经网络和径向基函数神经网络实 现了直接定位代价函数的快速求解,在保持定位精 度性能的条件下降低了算法的复杂度^[128]。

(2) 模型误差条件下的智能化直接定位与误差 校正技术。在实际应用中,多种类型的模型误差可 能同时存在,并且往往也难以确定其数值到底是固 定的、波动的还是随机分布的,这使得误差条件下 的信号模型非常复杂。当模型误差难以准确建模, 通过常规的标校源或自校正的方法难以对误差进行 校正时,借助神经网络等数据驱动的智能化方法进 行直接定位的思路体现出了较强的吸引力。针对扰 动型的阵列模型误差,已有研究尝试使用基于多层 感知器的神经网络实现偏差的校准,该方法在有效 修正定位偏差方面取得了良好的效果^[129]。但是, 在探索更完备的模型误差种类、选取更优智能化方 法上依然需要开展大量的研究工作。

(3) 基于先进稀疏阵列的信号直接定位技术。 为提高直接定位技术对复杂电磁环境多目标的适应 能力,已有学者用非圆信号的特点以及稀疏阵列的 特性初步探索了增加运动单站直接定位技术自由度 的可能性^[98,100]。虽然基于稀疏阵列的直接定位技术 已经提出,但是稀疏阵列的优势还未在直接定位中 得到充分挖掘。并且,在使用稀疏阵列对信号进行 高自由度直接定位的同时,还需考虑通过信号处 理、阵列构型改造等手段保证高自由度下的定位精 度和分辨率性能,这一研究是使直接定位技术走向 工程应用的重要条件。

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Direct Position Determination: An Overview

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Abstract: Passive localization technology, which intercepts emitter signals and passively determines their positions, has important value in fields such as electronic reconnaissance, situation awareness, and rescue. The traditional passive localization technology approaches, such as triangulation, Time Difference Of Arrival (TDOA), and Frequency Difference Of Arrival (FDOA), require two steps to estimate the emitter position. First, the parameters related to the positions are estimated, and then the emitter positions were solved based on the previously estimated parameters. This process may lose information and optimization with data association and requires low system robustness. In recent years, the Direct Position Determination (DPD) method was developed to obtain the emitter positions directly by processing the original sampled signals, and it does not require the estimation of signal parameters. This method is robust and can achieve high performance under a low signal-tonoise ratio scenario. Additionally, it does not require parameter association. In this paper, we introduce DPD and present a comprehensive summary of existing research, including typical DPD methods based on different information types, DPD of special signals, high-resolution high-accuracy DPD, fast DPD algorithms, and the calibration techniques used to address DPD model errors. The prospect of a DPD application is also introduced. Key words: Passive localization; Direct Position Determination (DPD); Resolution; Localization accuracy CLC index: TN958 Document code: A Article number: 2095-283X(2020)06-0998-19

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1 Introduction

Passive positioning technology is a technology that only uses signals intercepted by single or multiple receiving stations to determine the location of a radiation source. Compared with active positioning methods, such as radar, this technology has the advantages of good electromagnetic concealment and long positioning distance. Additionally, it has important application value in military and civilian fields such as electronic reconnaissance, situation awareness and rescue, unmanned driving, and intelligent logistics. As a result, passive position technology has become a research hotspot in these areas^[1-26].

According to the steps of estimating the posi-

tion of the radiation source, passive positioning techniques can be divided into two categories, namely the traditional two-step method and the one-step method. The basic idea of traditional two-step positioning^[1] is: the first step is to intercept the signal of the radiation source through the receiver, process the originally sampled signal, and use methods, such as spatial spectrum^[2-4], to</sup> estimate positioning parameters that contain the position of the radiation source. The second step is to use the relationship between positioning parameters and the position of the radiation source to establish and solve equations to achieve positioning. The positioning parameters estimated in the first step are varied, such as the phase difference caused by the signal reaching the interferometer with different antenna wavelength differences^[5-7], or the time difference $(TDOA)^{[8-11]}$, the frequency difference of the signal arriving at different observation stations $(FDOA)^{[12,13]}$ and Doppler rate^[14-17], or the direction of the signal ar-</sup> rival angle $(DOA)^{[18-20]}$, and the Received Signal

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Strength (RSS)^[21–25]. In fact, the above positioning parameters correspond to positioning lines or positioning surfaces (curved surfaces) in space^[26]. For example, TDOA corresponds to hyperboloids or hyperboloids, DOA corresponds to straight lines or planes, and FDOA corresponds to equal frequency difference surfaces. The traditional twostep positioning method uses these positioning lines or positioning planes to intersect in the second step to estimate the location of the radiation source using an exhaustive search method^[27,28], least square method^[29], pseudo-linear method^[30], Taylor expansion, gradient combination method^[31], or other methods.

Another passive positioning method is the one-step positioning method. Compared with the traditional two-step positioning method, the onestep positioning method does not require the process of estimating positioning parameters; however, it directly processes the original sampled signal and uses the radiation source position information contained in the signal to construct an objective function (cost function) related only to the position of the radiation source. Positioning is achieved through optimization algorithms such as an exhaustive search^[32–37]. Because the one-step position method achieves a direct estimation from the signal to the position of the radiation source, it is generally called the Direct Position Determination (DPD). The basic idea of DPD can be traced back to the distributed processing method proposed by Wax and Kailath^[38] in 1985 and then formally proposed by $Weiss^{[33]}$ in 2004.

According to research^[39–44], there are advantages and disadvantages of the direct positioning methods compared with traditional two-step positioning methods. Because DPD does not need to estimate positioning parameters, it avoids the correlation process of different radiation source parameters that can locate signals that are difficult to process with traditional methods such as the same frequency and same time method^[39]. In addition, the cost function of DPD is only related to the position of the radiation source, which uses the prior information of the signal from the same radiation source^[33], so it has higher positioning accuracy under a low signal-to-noise ratio. Finally, in the case of model error interference, DPD has better robustness than the two-step method^[40-42]. While DPD gains the above advantages, it also comes with a certain cost. The calculation is relatively large because DPD processes the original sampled signal instead of the positioning parameters like the two-step positioning method, and it is difficult to obtain the analytical solution of the radiation source position^[45]. Fig. 1 shows a schematic diagram of a traditional two-step positioning system and a direct positioning system.

Various scholars have studied DPD since it was proposed. This article summarizes the research results of direct positioning technology worldwide based on the five important issues currently studied by DPD. The specific arrangement of this article is as follows: Section 2 introduces typical direct positioning technology based on different types of information; Section 3 summarizes the direct positioning technology for some special signals; Section 4 analyzes the results of direct positioning in high-resolution and high-precision; Section 5 summarizes the research of direct positioning in a relatively low complexity; Section 6 describes existing direct positioning model error correction technology, and Section 7 is a summary of the potential direct positioning technology.

2 Typical Direct Positioning Technology based on Different Information Types

For the traditional two-step positioning method, the positioning parameters, such as DOA, TDOA, and FDOA, used to achieve positioning can also be called observations. Although DPD does not need to estimate these parameters, it is still necessary to consider which variables the radiation source location information contains when modeling the signal. To distinguish from the twostep method, the variables containing the radiation source location information in the DPD are collectively called the information type. The early research on DPD mainly focused on building signal models based on different information types and then using different signal models to construct cost functions to achieve positioning. The



Fig. 1 Diagrammatic drawings of DPD and two steps localization systems

earliest direct positioning is based on two information types including Angle Of Arrival (AOA) and TDOA^[33], which uses multiple fixed arrays to locate a single narrowband signal. In addition to considering the AOA of the radiation source through the array response, it also uses Fourier transform to extract TOA information from the signal and finally builds a signal model based on AOA and TDOA. Subsequently, a cost function related to the location of the radiation source was established using the least square method, and finally, the location of the radiation source was estimated by an exhaustive search method. The simulation results show that in the case of a low signal-to-noise ratio, the DPD positioning accuracy was better than the two-step positioning method using only AOA, the two-step positioning method using only TDOA, and the combination of the two. The direct positioning of a single radiation source can also be extended to the direct positioning of multiple radiation sources using the same two information types as AOA and $TDOA^{[46,47]}$.

When the location information of the radiation source brought by TDOA cannot be used, direct positioning can be achieved using only DOA. For example, when only a single motion array is used to intercept and locate the signal, there is no TDOA where multiple observatories intercept the signal. In this case, DOA can be used to construct a direct positioning cost function for positioning^[34,35,48]. When the response vector of multiple arrays needs to be combined by coherent processing, TDOA can be regarded as the unknown phase quantity of the observation signal to avoid the case that the observation model cannot be processed coherently, and a coherent direct positioning cost function based only on DOA can be constructed, which realizes positioning^[49].

In addition, when the Doppler frequency shift is significant, the information type of FDOA can also realize the direct positioning of the radiation source^[42–45], which uses spatially distributed multiple moving single sensors to intercept the signal of the stationary radiation source. Assuming the signal carrier frequency is known, the direct relationship between the intercepted signal and the position of the radiation source can be established. The Maximum Likelihood (ML) criterion is used to construct the cost function, and the exhaustive search method is used to achieve the direct positioning of the radiation source. In addition to the direct positioning method that only

uses the information type of FDOA, the type of information related to the Doppler effect is often combined with other types of information in direct positioning to improve the accuracy of positioning. For example, direct positioning methods based on TDOA and FDOA have been proposed^[50–52]. Additionally, multiple moving single sensors have been used to intercept signals from stationary radiation sources. In addition to FDOA, the TDOA is caused by the wave path difference of the signals reaching different sensors; thus the model directly between the intercepted signal and the position of the radiation source is established, and direct positioning is achieved through an exhaustive search method. Multiple moving arrays have been used to intercept stationary radiation source signals^[53], which ignores TDOA, and proposes a moving multistation direct positioning method based only on the AOA and FDOA. If the observation station and radiation source are relatively static, the Doppler effect can be ignored. At the same time, only the information type of TDOA contains the location information of the radiation source. In this positioning scenario, a multistation direct positioning method based only on TDOA was $proposed^{[45,54]}$.

Various types of information can be used in direct positioning, including DOA, TDOA, FDOA, and Doppler shift. In practical applications, direct positioning selects the appropriate information type according to the specific positioning scene settings. For example, if multiple stationary single sensors distributed in space are used for direct positioning, only TDOA needs to be considered. If multiple stationary arrays distributed in space are used for direct positioning, DOA and TDOA need to be considered. If the observing station is moving, additional Doppler parameters are required to be considered, such as FDOA. Selecting the appropriate information type and establishing an accurate signal model are prerequisites for ensuring the accuracy of direct positioning.

3 Direct Positioning Technology for Special Signals

For DPD, the model of intercepting the sig-

nal is the key to realizing positioning to construct the cost function. Most of the existing research on signal direct positioning technology focuses on narrowband signals^[33-56]. In this section, we mainly introduce related research on the direct positioning of special signals. To increase the adaptability of DPD to signal types and expand the application range of DPD, many scholars have conducted research on the direct positioning of special signals. These studies can be divided into two categories. One category is for signals that cannot be processed by the original direct positioning method. By adding preprocessing, improving the cost function, and other means, the direct positioning method has the ability to process such signals. The other type is to use the properties of special signals as prior information in the direct positioning process to improve the cost function, thereby improving the performance of direct positioning.

3.1 The first type of special signal

The first type of special signals processed by direct positioning mainly included broadband signals, frequency hopping signals, and coherent signals. Weiss^[57] was the first to consider the direct positioning of general broadband signals. A model was established for multistation interception of broadband signals in motion. The direct positioning cost function was constructed using the two information types of TDOA and FDOA, which extended the application of direct positioning to the general broadband signal. LI Jinzhou *et al.*^[58] divided the wideband signal into multiple segments for coherent accumulation processing, which further improved the performance of the direct positioning for wideband signals. This coherent accumulation signal processing method will also be introduced in the next section. In addition, the wideband signals intercepted by multiple observation arrays can be used to construct a cost function based on space-time observation vectors. This processing method embeds all intercepted signals in a single space-time covariance matrix, which effectively improves the robustness^[59,60] and degree of freedom^[61] of DPD. The bandwidth of the broadband signal considered above is actually small compared with the carrier frequency; therefore, the Doppler variation of the baseband signal was ignored. MA Fuhe *et al.*^[62] considers a signal with a larger bandwidth whose bandwidth is equivalent to the sampling rate. Therefore, the intercepted signal can be modeled as a function of translation and scaling over time. The cost function based on ML is constructed on this basis, which achieves the direct positioning of this type of signal.

It is generally assumed that the signal frequency is fixed; however, the current time-varying frequency signals, such as frequency hopping communication signals, are also widely used. Because multiple sub-bands of the frequency hopping signal only occupy part of the bandwidth within the frequency band, and there are only a few nonzero features in the frequency band (which is the frequency domain limited distribution characteristics), OUYANG Xinxin et al.^[63] used the discrete spectrum of the frequency hopping signal to establish an intercepted signal model. The direct positioning cost function is constructed based on the two methods of ML and maximum correlation accumulation to realize the direct positioning of a single frequency hopping signal radiation source. In actual situations, frequency hopping signals and fixed frequency signals may exist at the same time; however, there is no relevant research so far. There is still a considerable gap in the research of direct positioning technology for more complex electromagnetic environments.

In addition, coherent signals have been extensively studied by scholars in array signal processing^[64-69]. For direct positioning, if you still use the MUltiple SIgnal Classification (MUSIC) method to construct the cost function, the positioning performance will be severely attenuated or even invalid. For this reason, GUO Linpeng *et* $al.^{[70]}$ proposed a direct location algorithm based on decoherent MUSIC, which achieved direct location of coherent signals through conjugate reconstruction of the received signal covariance matrix; ZHOU Tao *et al.*^[71] proposed the use of adaptive iteration to avoid the rank deficit of covariance matrix, which can also realize the direct localization of coherent signals. In addition, spatial smoothing and other methods are effective in coherent signal array direction finding^[72–74], so they can also be extended to direct positioning. The advantages and disadvantages of the corresponding methods are analyzed and discussed in direct positioning.

3.2 The second type of special signal

The second type of special signals processed by direct positioning mainly includes Orthogonal Frequency Division Multiplexing (OFDM) signals, noncircular signals, constant modulus signals, cyclostationary signals, and synchronous coherent pulse train signals. OFDM is a widely used signal modulation technology that can effectively combat the problems of chromatic dispersion channel and multipath. The OFDM signal is generated through the Inverse Fourier Transform of the transmitter and then converts to the frequency domain through the Fast Fourier Transform at the receiving end. Refs. [75,76] proposed a direct positioning method based on ML for OFDM signals. This method not only considers the unknown data tones in the OFDM signal but also considers the known pilot tones). As a result, a Maximum Likelihood Estimator was proposed for estimating its position. The performance is better than the general DPD that ignores the known pilot part. Ref. [77] proposed a direct location method for OFDM signals based on a spectrum, which reduces the dimensionality of the search. The noncircular complex signal is also a signal that has attracted much attention^[78-82]. Compared with the circular complex signal, the greatest difference is that the real and imaginary parts of the noncircular complex signal are not independent. Common noncircular complex signals have amplitude modulation, amplitude shift keying, and binary phase shift keying. Refs. [83,84] used the above properties of noncircular complex signals to directly locate the signals. The performance of direct positioning is improved with the introduction of prior information. The constant modulus signal (phase modulation signal) is a type of communication signal that is widely used,

such as FM, FSK, and PSK, and their notable feature is that their complex envelope has a constant modulus characteristic. Using this feature, WANG Ding *et al.*^[85] improved the constant modulus signal direct positioning cost function, and the constructed direct positioning method based on ML significantly improved the accuracy of the target position. A cyclostationary signal is a signal with a periodic autocorrelation function. With this periodicity, the discrete Fourier transform of the signal autocorrelation can be rewritten^[86] to construct a periodic direct positioning method. This method has shown excellent performance in both white Gaussian and narrowband interference environments.

SCPT is a common signal type in coherent pulse radar systems that is a pulse train signal with the same initial phase formed by continuous wave interception generated by a stable main oscillator. Based on this characteristic of the SCPT signals, the position can be achieved only by a single moving antenna, Doppler, and Doppler frequency shift. The specific method was introduced^[87]. In addition, based on the characteristics of this type of signal, we proposed a singlestation coherent direct positioning technology^[88]. The simulation shows that although the positioning accuracy was not improved, the resolution improved significantly.

4 High-resolution and High-precision Multitarget Direct Positioning Technology

With the increasingly complex electromagnetic environment, the realization of high-precision and high-resolution positioning of multiple radiation sources has become an urgent need in the field of passive positioning. Similarly, many scholars are committed to studying high-resolution and high-precision direct positioning. At present, the related research is mainly divided into two categories: to improve the resolution and positioning accuracy of direct positioning by improving the method of constructing cost functions and to achieve high-resolution and high-precision direct positioning by improving the signal processing method.

4.1 Improved cost function

The earliest direct positioning method used the least squares or ML criterion when constructing the cost function $^{[33]}$. However, to realize the localization of multiple radiation sources, Refs. [46,47] proposed direct localization using the MU-SIC algorithm to construct a cost function. However, before using the MUSIC method, it is first necessary to estimate the number of radiation sources. In order to avoid this problem, Refs. [89–93] proposed to use the Minimum Variance Distortion less Response (MVDR) method to construct the cost function of direct positioning. Alternatively, Ref. [89] used an observation signal model that only contains the information of Doppler frequency shift. The observation signal models used by Ref. [90] contained DOA and TDOA information types, while those used by Refs. [91,92] contained DOA and FDOA information types, and the signal model used by Ref. [93] contained only DOA information types. Regardless of the cost function established on the basis of the intercepted signal model of the MVDR, its resolution is better than the cost function constructed based on ML, and the positioning accuracy of adjacent radiation sources is also greater. However, its resolution is nearly the same as the cost function based on MUSIC, and as evaluated in the Ref. [94], when there are multiple radiation sources, the problem of direct localization based on MVDR is progressively biased^[95–97]. The positioning accuracy is difficult to reach the theoretical Cramér-Rao Lower Bound (CRLB).

In addition to the two improved direct location cost functions, MUSIC and MVDR, the author of this article has tried to construct a cost function based on the Eigen Space (ES)^[48]. This type of cost function is an improvement to the cost function based on MUSIC, which can be expressed as:

$$f_{\rm es} = \frac{f_{\rm e}}{f_{\rm MUSIC}} \tag{1}$$

Among them, the denominator f_{MUSIC} is based on the cost function of MUSIC, and the numerator is established using the orthogonal characteristics of the noise subspace and signal subspace. If the current search position is at the true position of the radiation source, it is a larger value. However, if the current search position is not at the real position of the radiation source, its value is nearly zero. This is equivalent to a weighted MUSIC improvement method, which can effectively improve the resolution of direct positioning. In a Monte Carlo simulation, two adjacent radiation sources in space are directly located, and the normalized spatial spectrum contour map of each cost function is shown in Fig. 2.

4.2 Coherent processing

To improve the resolution and precision of DPD, some researches try to process the observation signal through the coherent processing method to construct the cost function of the coherent type. At present, the direct positioning coherent processing method can be divided into two types. One is proposed for wideband signals^[58], which divides a complete wideband signal into multiple nonoverlapping short-time signal segments and is equivalent to multiple short-time signal segments. A narrowband signal is sampled, and these shorttime signal segments are processed separately. At the same time, the cost function is constructed by accumulation to estimate the position of the radiation source. Compared with the noncoherent direct positioning method^[57], this processing method uses the two information types of TDOA and FDOA, and the cost function is also established based on the ML method; however, the former has higher positioning accuracy. Another kind of coherent processing is to combine the array response vectors of multiple arrays into a large array response vector^[49], and convert the signal processing of multiple arrays in space into a large array in space. The signal processing can be equivalently regarded as an increase in the aperture of the array. The schematic diagram of this coherent treatment and other noncoherent treatments



Fig. 2 The unitized contours of the cost functions based on ES, ML, MUSIC and MVDR (The stars stand for the real positions of the emitters)

is shown in Fig. 3. Through this processing, the positioning accuracy and resolution of the direct positioning are greatly improved; however, because of the improvement of the joint array vector dimension, the amount of calculation also greatly increased. In addition, because this kind of coherent processing equates multiple arrays into one array, its positioning performance is greatly affected by factors such as the time-frequency asynchrony between the arrays and the error of the array model.

4.3 Improved array configuration

The direct positioning technology mainly relies on a uniform linear array to achieve signal interception, and uses the method of spectral decomposition to achieve the positioning of multiple radiation sources. Therefore, the maximum number of radiation sources that can be located is M-1, where M is the number of elements of the uniform linear array. This low-degree-of-freedom direct positioning technology is difficult to meet the current complex electromagnetic environment with multiple targets. To solve this problem, the coprime array in the Sparse Array (SA) was first applied to the direct positioning of noncircular signal waveforms^[98], which realized the degree of freedom of direct positioning and the improvement of positioning accuracy. This work is based on the increase of the array aperture and observation data dimension based on the characteristics of the noncircular signal. In fact, the performance improvement only comes from the increase of the physical array aperture of the coprime array and the characteristics of the noncircular signal, and it does not make full use of the difference coarray of the coprime array. For noncircular signals, to fully explore the improvement of direct positioning performance by the characteristics of sparse arrays, Refs. [99,100] introduced coprime arrays and nested arrays into the direct positioning of noncircular signals, except for the application of noncircular signals. This work uses the advantages of nested arrays and coprime arrays to increase the degree of freedom of direct positioning.

In addition to the effect of increasing the degree of freedom of the improved array configuration, it also improves the positioning accuracy and resolution. Recently, the author of this article proposed a direct positioning method based on a Rotating Linear Array (RLA)^[88]. The rotation of the array is driven by a time-varying mechanism, such as a turntable, to realize the time-varying of each array element relative to the reference array element. The schematic diagram of the structure is shown in Fig. 4, where ω is the rotation angular velocity and d is the interval of the array elements. After theoretical performance analysis and computer simulation verification, the



Fig. 3 Diagrammatic drawings of coherent processing and noncoherent processing of DPD

results indicate that the use of rotating uniform linear arrays to intercept signals and construct a suitable direct positioning cost function can significantly improve the positioning accuracy and resolution of direct positioning, which also eliminates the positioning blur area of fixed uniform linear arrays and increases the observability of the system. The Geometrical Dilution Of Precision (GDOP) calculated by CRLB for direct positioning using a single uniform linear array and a rotating uniform linear array is shown in Fig. 5.

In addition to applying sparse arrays and rotating arrays to direct positioning, some scholars use Multiple-Input Multiple-Output (MIMO) systems to direct positioning. Using multiple receiving antennas of MIMO radar to intercept target signals, Ref. [101] proposed a direct positioning algorithm based on ML. This method makes full use of the advantages of MIMO radar resolution accuracy, which is suitable for active and passive conditions. The two MIMO systems show higher positioning accuracy than the two-step method



Fig. 4 The diagrammatic drawing of rotating array

under a low signal-to-noise ratio. Ref. [102] proposed a direct positioning algorithm based on MIMO under multipath conditions to achieve high-precision positioning of known signal sources. The abovementioned positioning methods all use two kinds of information, AOA and TDOA, while the Ref. [103] proposed a method that uses MIMO radar to achieve direct positioning based only on a Doppler frequency shift. It is effective in active application scenarios where a mobile station sends a signal, which is received by multiple stationary observing stations after being transmitted by a target.

In addition to the three methods introduced above, some scholars also use sparse reconstruction or compressed sensing to directly estimate the location of the radiation source^[104,105]. This processing method does not require a priori information on the number of radiation sources and improves the direct positioning accuracy and resolution in a state where the number of samples is small.

5 Fast Direct Positioning Algorithm

After the cost function of direct positioning is given, the position of the radiation source can be solved by the cost function. It is difficult to give an analytical solution for the position estimation because of the high degree of nonlinearity between the cost function and position of the radiation source. At present, most of the existing direct positioning methods are solved by exhaustive search methods. However, compared with the



Fig. 5 The GDOP of DPD using stationary array and rotating array

intermediate parameters in the two-step positioning method, the exhaustive search processes the original signal sampling points, and the amount of data is extremely large, so the computational complexity is also high. The exhaustive search method needs to divide the grid in the feasible solution space, and the divided grid density determines the calculation, which causes a contradiction between the computational complexity and accuracy.

Currently, Alternating Projection (AP) technology^[106], Decoupled Algorithm (DA)^[52], Expectation Maximization (EM)^[45], and Newton or Taylor series iteration algorithms^[56,107] have been applied to quickly solve the cost function of direct positioning. The AP algorithm can effectively convert a multidimensional search into a multiple low-dimensional search in solving the direct positioning problem based on ML, which reduces the computational complexity to a certain extent^[108]. The EM algorithm can also be used to solve the computational complexity problem of the multistation direct positioning based on ML, which establishes the output of all array elements as incomplete data and establishes the distance between all array elements and the position of the radiation source as unobserved complete data. The EM algorithm separates the position of the radiation source, and the different gains of each array and signal emission time convert the multidimensional optimization problem into multiple low-dimensional optimization problems. Direct positioning of a single target by multiple stations has obvious effects. Ref. [52] proposed a fast-decoupling algorithm for noncircular signals. Using the characteristics of noncircular signals, this method can convert the eigenvalue decomposition problem of complex numbers into eigenvalue decomposition of real numbers, and at the same time, convert the 2Q-dimensional optimization problem into Q 2-dimensional iterative optimization problems. It is essentially a kind of AP algorithm that uses noncircular signals. The AP algorithm improved by the characteristics of noncircular signals is only effective for noncircular signals, and it is equivalent to the AP algorithm for

other signals. The direct positioning method uses the maximum eigenvalue of the matrix as the cost function, which is based on the Hermitian matrix eigenvalue perturbation theorem, and the type of cost function can be solved iteratively using Newton iteration^[56]</sup>. In addition, it can also be implemented similarly using the Taylor series iteration rule^[107]. All methods greatly reduce the computational complexity of solving the direct positioning cost function. Similar to other iterative methods, these two methods are sensitive to the initial iteration point. When the initial point is incorrectly selected, it is easy to cause iteration divergence. Related literature proposes to use a two-step method^[56,107] to determine the initial point; however, this idea may fail under a low signal-tonoise ratio, and it is difficult to reflect the adaptability of DPD to a low signal-to-noise ratio.

It is difficult for the methods mentioned above to avoid the problem of repeated low-dimensional search or initialization of the cost function. To further reduce the computational complexity, some scholars try to apply intelligent optimization algorithms to solve the cost function of direct positioning^[48]. In fact, using the direct positioning cost function to solve the position of the radiation source is an optimization problem, and the optimization problem is a problem widely existing in various fields of scientific research. From the perspective of the number of extremum solutions to the optimization problem, solving the direct positioning cost function is essentially Multimodal Optimization (MO)^[109]. The algorithm based on Ring Neighborhood Topology based PSO (RNTPSO)^[110,111] has an ideal effect in solving this problem. Therefore, the author of this article proposed a fast algorithm for direct positioning based on the fusion of a niche particle swarm optimization method (a kind of RNTPSO) and gradient class method (Broyden-Fletcher-Goldfarb-Shanno, BFGS) in Ref. [48], which greatly reduced the computational complexity of the direct positioning algorithm. The basic idea of this fast algorithm is to first use the niche-based particle swarm optimization method to cluster the evolution results through a simple clustering

method after a small number of particle evolution times to provide a rough estimate of the location of the radiation source; then, the gradient method iterates it until it converges. A possible cost function optimization process of the proposed algorithm is shown in Fig. 6.

6 Error Correction Technology based on the Direct Positioning Model

Like other parameter estimation problems, the high-precision feature of direct positioning to estimate the position of the radiation source is based on an accurate model. When there is an error in the model, the performance of direct positioning will be severely degraded. Therefore, analyzing the performance of the direct positioning method under the error model and studying methods to eliminate model error interference are of great significance for extending direct positioning to practical applications. This error correction has attracted a lot of attention^[39–42,112–115].

Refs. [39,41] tested the performance of the direct positioning method in the presence of error items such as array position error, multipath, and coupling. The results show that because direct positioning can ignore poor observations in the processing process and use high-quality observations for positioning, its positioning performance still maintains the advantages of the two-step positioning method under the condition of the error model. Similar to these studies, the Ref. [114] only considered the influence of the multipath phenomenon caused by the regional reflector on the direct positioning, and obtained similar results to those obtained in the previous literature. In addition, the Ref. [115] considered the impact of the multipath of Non-Line-Of-Sight (NLOS) path propagation on the direct positioning performance, and derived the analytical expression of the positioning error covariance matrix caused by the multipath in this case. The literature discussed above focused on verifying the performance of direct positioning under the influence of various errors. However, they did not propose a method that can effectively eliminate the interference of these errors.

Refs. [107,112] modeled the uncertainty of the array model caused by these errors as Gaussian random variables, and then used self-calibration to eliminate the interference of these errors. The method can effectively reduce the error of the array model and achieve the CRLB of positioning. However, this method relies on the prior information of the error, *i.e.*, the mean and covariance of the error are known. In actual situations, this prior information is difficult to obtain. Aiming at the deterministic sensor amplitude/phase error, Ref. [116] established the intercepted signal model under its interference, and constructed a self-correcting direct positioning method based on MUSIC



Fig. 6 The optimized process of DPD cost function based on RNTPSO and BFGS $% \left({{{\rm{B}}} \right)$

and ML, respectively. This self-calibration method does not require any prior information, and during the self-calibration process, the estimation of the sensor amplitude/phase error is given in the form of analytical solutions, and the amount of calculation is small, so it has good practicability. However, because the accuracy of self-calibration depends on the signal-to-noise ratio of the external radiation source signal, when the signal-tonoise ratio is low, the self-calibration performance is attenuated, which does not guarantee the advantage of direct positioning with high positioning accuracy under low SNR.

To solve this problem, it is customary in engineering applications to calibrate the deterministic error with a radiation source (calibration station) with a known position of the friend. Ref. [117] considered the problem of multiple sensors clock synchronization, and used several anchor sources (such as broadcasting stations with known locations) to calibrate the clock synchronization. For the problem^[116], the author of this paper proposed a direct positioning method based on the calibration source to correct the amplitude/phase error of the deterministic sensor^[118], which considered two types of accurate known and unknown signals of the calibration source. In this case, the given corrective positioning algorithm can reach the corresponding CRLB.

7 Summary and Outlook

7.1 Summary of signal direct positioning technology Direct positioning can be classified according to the type of information for direct positioning, the type of array used to intercept the signal, and the method used to construct the cost function. It also performs in terms of computational complexity, positioning accuracy, resolution, and degrees of freedom. A summary of the direct positioning technology is shown in Tab. 1, where ExS means exhaustive search.

The above are all direct positioning techniques under the background of passive positioning applications; however, many scholars have discussed direct positioning techniques under active conditions $[^{46,58,101,103,107,119-123}]$. The difference between the two is mainly reflected in the unknown and accurate known signals intercepted by the receiving $sensor^{[46,103]}$. From the perspective of signal processing, the model when the signal is simpler, and the constructed cost function is more intuitive^[58]. Even under the condition of known signals, the advantage of direct positioning compared with the traditional two-step positioning method of low signal-to-noise ratio and stronger adaptability is still maintained^[119]. This feature allows direct positioning to be widely used in radar systems such as MIMO^[101–103,120,122]. In addition, some scholars introduced the technology of long synthetic aperture into direct positioning^[124], forming a long array aperture through the mobile simulation of a single platform, and processed the intercepted data in the manner of synthetic aperture radar to realize the positioning of the radiation source. This technology is essentially a moving single-station direct positioning technology.

Tab. 1	Conclusive	table	of DPD
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Info type	Array	Cost function	Optimization	Reference	Precision	Resolution	DoF	Complexity
DOA/TDOA	ULA	ML	ExS	[33]	Mid	Low	Low	High
FDOA	ULA	MUSIC	ExS	[46, 47]	Mid	Mid	Low	Mid
TDOA/FDOA	ULA	ML	ExS	[50-52]	Mid	Low	Low	High
DOA/FDOA	ULA	ML	Exs	[53]	Mid	Low	Low	High
DOA/TDOA	ULA	MVDR	ExS	[89-93]	Mid	Mid	Low	Mid
DOA	ULA	ES	RNTPSO	[48]	Mid	High	Low	Low
DOA/TDOA	MIMO	ML	\mathbf{ExS}	[101, 102]	High	High	Low	High
FDOA	MIMO	ML	ExS	[103]	High	High	Low	High
TDOA/FDOA	ULA	ML(Coherent)	\mathbf{ExS}	[58]	High	Mid	Low	High
TDOA/DOA	ULA	MUSIC(Coherent)	\mathbf{ExS}	[49]	High	High	High	High
Doppler Shift/Rate	Antenna	ML	ExS	[87]	Mid	_	_	High
DOA	\mathbf{SA}	MUSIC	\mathbf{ExS}	[98 - 100]	Low	Mid	High	High
DOA	RLA	MUSIC	ExS	[88]	High	High	Low	Mid
DOA	ULA	MUSIC	AP	[106]	Mid	Mid	Low	Low
DOA/TDOA	ULA	ML	$\mathbf{E}\mathbf{M}$	[45]	Mid	Low	Low	Mid
DOA/TDOA	ULA	ML	DA	[52]	Mid	Low	Low	Mid

The difference is that this technology covers the process of estimating the frequency of the transmitted signal through a band-pass filter and Fourier transform processing, and the distance between the radiation source and the observing station is summed. The azimuth replaces the description of the position of the radiation source, and the joint estimation of the signal frequency and position of the radiation source is realized through the processing method of the synthetic aperture radar. This technology expands the design idea of the direct positioning algorithm.

7.2 Prospects of the signal direct positioning technology

Although many studies on direct positioning technology have been conducted, it is difficult to meet the current complex electromagnetic environment, high communication pressure (multistation direct positioning), and high computational complexity because of the limited degree of freedom. The results are hard to apply in engineering. In response to the abovementioned challenges that still exist in direct positioning technology, scholars have also achieved certain theoretical research results. For example, the adaptive direct positioning method is used to reduce the number of interstation forwarding and the communication pressure of multistation direct positioning^[125,126]; the method of mutual ambiguity function complementation is adopted to reduce the computational complexity of the cost function and the amount of data transmission between observation stations^[127]. From the perspective of the development of signal direct positioning technology, direct positioning technology aimed at practical engineering applications has become the main trend of the current research. There is great research value in improving the degree of freedom and resolution of direct positioning, reducing computational complexity, and eliminating typical errors in actual situations. Therefore, the following three aspects may be important for subsequent research.

(1) Direct positioning fast algorithm based on an intelligent optimization method. Solving the direct positioning cost function is essentially a multimode optimization problem. Rapid algorithm research of direct positioning based on intelligent optimization methods can further reduce the computational complexity of direct positioning, break through the limitations of existing hardware conditions, and is expected to realize real-time processing of direct positioning. Especially for direct positioning using a single observing station, real-time processing will also avoid the downloading of the original sampled signal and eliminate the limitation of hardware storage capacity. At the same time, considering the advantages of relying on a single observing station for direct positioning without time-frequency synchronization and no inter-station communication, it has good application prospects in engineering. At present, scholars have carried out preliminary explorations, using the trained multilayer perceptron neural network and radial basis function neural network to realize the rapid solution of the direct positioning cost function, and to reduce the complexity of the algorithm while maintaining the positioning accuracy performance degree^[128].

(2) Intelligent direct positioning and error correction technology under model error conditions. In practical applications, multiple types of model errors may exist at the same time, and it is often difficult to determine whether their values are fixed, fluctuating, or randomly distributed, which makes the signal model under error conditions overly complicated. When the model error is difficult to accurately model, and it is difficult to correct the error through conventional calibration sources or self-correction methods. As a result, the idea of direct positioning with the help of data-driven intelligent methods such as neural networks shows strong appeal. Aiming at the disturbance-type array model error, existing studies have used a neural network based on multilayer perceptrons to achieve deviation calibration. This method has achieved good results in effectively correcting the positioning deviation^[129]. However, a lot of research work is still needed to explore more complete types of model errors and select better intelligent methods.

(3) Direct signal positioning technology based on an advanced SA. For improving the adaptability of direct positioning technology to multiple targets in complex electromagnetic environments, scholars have used the characteristics of noncircular signals and the characteristics of SAs to explore the increasing degree of freedom of the moving single-station direct positioning technology^[98,100]. Although direct positioning technology based on sparse arrays has been proposed, the advantages of sparse arrays have not been fully exploited in direct positioning. Moreover, while using the sparse array to directly locate the signal with a high degree of freedom, it is also necessary to consider using signal processing, array configuration modification, and other means to ensure the positioning accuracy and resolution performance under high degrees of freedom. This research could lay the foundation for the engineering application of the direct positioning technology.

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